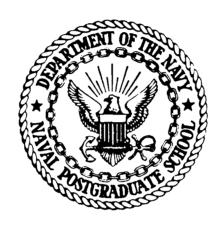


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# NAVAL POSTGRADUATE SCHOOL Monterey, California





# **THESIS**

THE DEVELOPMENT OF AN ENLISTMENT STANDARDS MODEL FOR THE NAVY AVIATION MACHINIST'S MATE (AD) RATING

by

Dwayne A. Oslund

and

J. S. A. Clark

June 1984

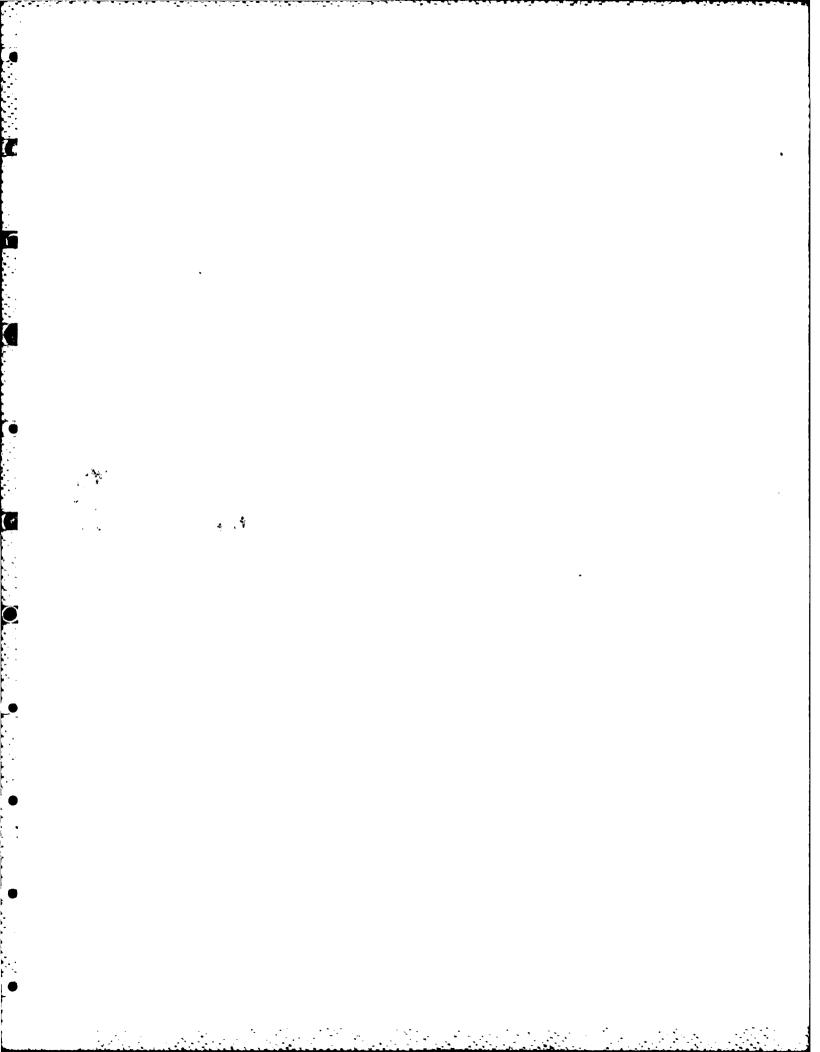
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#### AESIFACT

The purpose of this study is to present analytic techniques for developing enlistment standards models which attempt to improve upon existing methods. Alternative criteria for measuring successful operational performance, and a means of measuring utility are also provided. Another purpose of this study is to discover if the Navy's system of selecting personnel for the Aviation Machinist's Mate (AD) rating may be improved.

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#### I. INTECCUCTION

For the remainder of this decade and beyond, the Navy is faced with the difficult problem of attracting and retaining sufficient personnel to meet its ever increasing manpower requirements. The fleet is expanding toward 600 ships while the available manpower pool of 17 to 21 year old mer and women is projected to decline. Each year, millions dellars are spent recruiting, training and maintaining enlisted personnel. Numerous enlistment standards acdels have keer developed to improve the screening, selection and assignment processes for all Navy ratings. Cortiruing enlistment standards research is important since it may improve manpower planning, reduce attrition, enhance job performance, and lergthen careers. It is through such research that the ultimate gcal of increased readiness at lower cost may be realized.

#### A. PUBFCSE OF ANALYSIS

This study attempts firstly to improve upon the method-clogy presently utilized to develop enlistment standards models. In particular, different techniques for developing such models are presented, along with alternative criteria for measuring successful performance. A means of measuring the utility, or usefulness, of such efforts is also provided. An attempt has been made to present these methods in a clear manner so that those researchers who follow may more readily understand the process. The analysis expands upon the experience of numerous similar efforts, including several graduate these prepared at the Naval Postgraduate School and many research projects conducted under the

auspices of the Navy Personnel Research and Development Center (NFREC) and the Center for Naval Analyses (CNA).

The secondary purpose of this study is to discover if the selection standards for one particular Navy rating may te improved upon by analyzing data available at the time of Most predictive models developed to date have focused on successful completion of technical training schools, or on attrition. This study is aligned with a more recent analytic trend of attempting to predict successful cperaticral performance in the fleet. This approach is considered most appropriate in today's highly technical The tremendous cost, in terms of both dollars and time, associated with training and retaining Navy personnel demands maximum return on investment. By focusing on operational success to develop a larger, more experienced career force, there exists the potential to reduce the burden of recruiting and training new enlistees.

#### E. FATING SELECTED FOR ANALYSIS

Ic accomplish the above stated purposes, data pertaining to crerational performance of personnel in the Aviation Machinist's Mate (AL) rating were analyzed. ADs are aircraft engine mechanics who inspect, adjust, test, repair and overhaul engines used in all Navy airplanes and helicop-Als also rerform routine maintenance, aircraft for flight, and assist in handling aircraft or the ground or aboard ships. They perform maintenance servicing on either jet or reciprocating engines, subsystems such as fuel, oil, induction, compression, combustion, turbine and exhaust. Other AD functions include supervising maintenance, analyzing fuel and oil samples, keeping records, evaluating engine performance, and maintaining accessory components, drive systems and gear boxes.

Aviation Machinist's Mates are assigned primarily to Naval Aviation squadrons or to Aircraft Intermediate Mainterance Departments. These assignments may be either afford or ashore. Als may also be assigned as instructors in training activities, and they are eligible to volunteer for flight duty as aircrewmen. [Ref. 1]

Fresently, there are over 13,000 men and women assigned to the AE rating. Since ADs are assigned to virtually every Navy aviation unit, they represent a vital element in ensuring a high degree of aircraft readiness is maintained. As such, the overall mission effectiveness of Naval Aviation units is directly linked to the quality and performance of members of the AE rating.

#### C. CEGANIZATION OF TELS STUDY

This chapter has discussed the purpose of this study. and d∈scrib∈d the AD rating and its importance to the Navy. The next chapter will provide background information on enlistment standards research, and present in general terms the evolution of predictor and criterion variables that emerged during the development of the models contained in this research. Charter III describes the data base and AD data set that provided specific measures of operational performance for analysis and model formulation. Chapter IV presents the three statistical analysis techniques employed in developing six erlistment standards models. Charter V provides the method and results f the utility analysis conducted on these acdels. Utility analysis represents a means by which the usefulness of similar efforts may be Chapter VI draws conclusions from the analysis and presents recommendations for further research.

#### II. SELECTION OF VARIABLES

This chapter gives a brief description of some of the selection procedures in use at the time of the data collection. The results of previous research on predicting job performance are reviewed and predictor and criterion variables that have been shown to be useful are identified.

#### A. SELECTION BACKGROUND

At the time the data used in this analysis was collected, the Navy considered a number of applicant characteristics to guide selection and classification decisions. These characteristics included education, high school degree status, age, number of dependents, scores on the 12 Armed Services Vocational Artitude Eattery (ASVAB) subtests. some composite scores. The Armed Forces Qualification Test (AFQI) is one of these composite scores, and an applicant's score on the AFQI depended on the sum of his scores on the ASVAE sultests Arithmetic Reasoning (AR), Spatial Perception (SP), and Word Knowledge (WK). The AFQT score was reported as a rercentile -- a score of 80 meant that an applicant's total sccre on the three subtests was higher than the scores achieved by 79 percent of his peers. The AFQT rercentile score was also used to classify the applicant into one of five mental categories or AFQT groups. For example, these with a score of 90 or better were classified in mental group I, and those with a score of 10 or less were classified as group Vs.

Arcther composite score is the Success Chances of Feccuits Entering the Navy (SCFEEN) score. This sccre is derived from the personal characteristics of age at entry.

years of schooling, whether or not the applicant had dependents, and AFQT percentile score. This composite score has been used by recruiters since October 1976 in determining an applicant's eligibility to enlist. [Ref. 2]

A final composite score that is used in classifying recruits to the AD rating is made up of the sum of the recruit's standardized scores on the ASVAB subtests Arithmetic Reasoning (AR), Electronic Information (EI), General Science (GS), and Mathematical Knowledge (MK). A minimum score of 190 on this composite was necessary for a recruit to enter the AD rating.

#### E. REVIEW OF PREVIOUS MILITARY STUDIES

Studies on predicting military job performance have mainly concentrated on the survivability of recruits through various stages of their military careers. These stages include recruit training, Class "A" School, first two years of enlistment and first term of enlistment.

Iurie used number of dependents, years of education and AFQT score to predict the performance of the Electronic's Technician (ETN) and Ship's Serviceman (SH) ratings. He found that for the SH rating, non-high school graduates with lower AFQT scores were promoted faster than those with higher scores, although AFQT score had no impact on first term strvival. The AFQT score did aid in predicting advancement and survival for members of the ETN rating. [Ref. 3] In another study of eight year survival rates, Iurie found that education level was the most important predictor. Interestingly he also found that mental group I recruits had the worst record in surviving Class "A" School. [Ref. 4]

A study on the factors affecting first term survival and retertion behavior of Machinist's Mates (MM) and Boiler

Technicians (BT) was conducted by Fletcher in 1979. He found that ETs with greater than 11 years of education had greatly improved charces of surviving their first term of enlistment. For MMs, those in the lowest and highest mental groups had greater survival probability than others. For both ratings, older men had a higher probability of survival. In relation to reenlistment, those BTs with 12 or more years of education had a low probability of reenlistment, while with MMs, having a dependent increased the probability of reenlistment, while with MMs, having a dependent increased the probability of reenlistment. [Ref. 5]

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Studies of military job performance have also investigated the effect of the Delayed Entry Program (DEF) on survival. Lockman found that if recruit quality (as measured by SCREEN) and training guarantees were controlled for, those the mere in the LEP for three or more months had the highest survival rates [Ref. 6]. Thomason found that DEP, age, education, recruit training location, race, number of dependents, mental group and follow on tour assignments had varying degrees of significance in determining first term survivalility [Ref. 7].

More recent studies have favored the use of multiple, rather than single measures of job performance. This is because it is rare that a single measure adequately covers the full scope of job performance. One approach has been to expand the survivability criteria to include other measures of job performance, such as eligibility to reenlist and the achievement of certain paygrades. A continuous criterion is not available under this approach; sailors are either categorized as a success or as a failure. Nesbitt [Ref. 8] and Sryder and Bergazzi [Ref. 9] defined various degrees of success or failure in their studies in an effort to generate more variability on the criterion.

#### C. CEITERICN AND PREDICTOR VARIABLES

In most cases when a single job performance measure (critericn) has been used in previous research, a measure of survival has been the overwhelming choice. This is recause such a criterion is readily measurable, is continuous, and is of importance to the Navy since the costs associated with attrition and subsequent replacement are considerable. Other single criteria have been length of service (IOS), time to promotion, highest rank or grade achieved, retertion (as measured by reerlistment choice), and performance at Class "A" Schools.

The common predictors of jcb performance are education, number of dependents, age, sex, race, ASVAB subtest scores, AFQT scores, mental group, DEP status, and some "after accession" variables such as recruit training location, subsequent dependent status, and initial and follow on duty assignments.

In this study two criteria will be considered. The first will be an LCS criterion and the second will be a composite criterion where success will be defined as completing the first term of enlistment, being eligible for reenlistment, and achieving the paygrade E-4. The candidate predictor variables will be age at entry, sex, race, entry paygrade, education, dependent status, term of enlistment, ASVAE subtest scores, AFQT scores and the composite score to qualify for the AD rating. The specific variables from the AD data set used for analysis, as well as the evolution of the data set, are discussed in the next chapter.

#### III. CATA FASE DEVELOPMENT

This chapter provides information concerning the master data hase and the subset of this master file, the AD data set, that was used in this study. The generation of this AD data set is described in detail, as are the specific predictor and criterion variables discussed in the previous chapter.

#### A. MASTER FILE

Erlisted history records on over 206,000 non-prior service sailors who entered the Navy during the period 1 September 1976 to 31 December 1978 were compiled by the Lefense Manpower Data Center (DMDC) staff. This master file was created by merging data elements from four separate files: (1) the DMDC Cohort file, which is itself a compilation of information from DMDC's Enlisted Master Record and Loss files: (2) a Navy Health Research Center (NHRC) file; (3) a promotion examination file; and (4) a Chief of Naval Education and Training (CNET) file.

The EMEC Cohort file contains personal and demographic data or individuals at the time they entered the service. Additionally, it is updated quarterly by the Military Personnel Commands with active duty or service separation information as appropriate. This file provided over 150 variables to the master file.

The NHFC file contains information on each enlisted member of the Navy who has been or still is on active duty. It is updated quarterly from Navy Military Personnel Command (NMPC) change tape extracts, and follows a service member from date of enlistment to date of discharge. The NHRC file represents approximately 30 variables in the master file.

The promotion examination file includes advancement exam and promotion data, and the CNET file contains information on formal training received by individuals in the data hase. Together these files provided over 60 variables to the master data hase.

The master file, containing 243 variables, is maintained at the Naval Postgractate School. The final update to the file includes DMDC data current as of 30 September 1982, and NHRC data current as of July 1982. The program to access data on the selected rating is contained in Appendix A.

#### F. AC DATA SET

This section describes the evolution of the AD data set that contains the observations and measures analyzed in this study. The AD data set was derived through a number of iterative screens, and new variables were created, in order to remove alternate observations and to refine the predictor and criterion variables prior to statistical analysis. These iterative steps ultimately reduced the number of cases in the AD data set from 5,562 to 2,820 observations. The programs used to screen the data and to create new predictor and criterion variables are contained in Appendix A. The logic for these processes is discussed in the remainder of this chapter.

#### 1. Screens

Since one purpose of this study was to analyze Aviation Machinist's Mates who had operational experience in the fleet, the first screen performed on the data was to select only those cases whose final DMDC rate (DMICRATE) appeared in the last master file update as ADs. This means

<sup>17</sup>he actual variable name associated with the comment is provided in parentheses throughout the remainder of this chapter.

they were working in the AD rating at either the time of their separation from the service, or at the time of the last file update if they were still on active duty. This screen allowed for people to migrate into the AD rating while ensuring that those cases who left for another rating were excluded from the analysia.

The cases were next screened for ADs with no prior Navy service (PRIORSEV). In addition, individuals who may have charged their social security number (SSNCHNGE) were removed from the sample. These screens ensured that no observations were courted more than once in the analysis.

The observations in the AD data were then screened to select only those people who were tested on ASVAE Forms 5, 6, or 7 (TESTFORM) at enlistment. These test forms were in use during the period in which the individuals in the data set enlisted. Also, those cases whose subtest scores (ASVAEs) were impossibly high were eliminated from the data set.

Iwc other screens were conducted to capture those cbservations who enlisted in either the Regular Navy or Naval Reserve (SERVACCS), and who were known to have signed up fcr at l∈ast four years active service (RECENLST). It is worth rcting that during scdel development, the term of enlistment measure (IFRMENLI) was consistently significant, but with a negative value for the parameter estimate. indicated that those individuals who enlisted for longer cbligated service actually served less time than those who signed up for shorter terms of enlistment. The parameter estimate for term of enlistment changed to a positive value when the RECENLSI screen was implemented. Apparently, by screening for four year active duty obligors, the data set then excluded those <u>reservists</u> who were required to serve cnly three years of their six year obligation on active duty. For these observations, a six year term of enlistment was an erroneous value for the TERMENLT variable. This important discovery reveals a probable flaw in earlier similar enlistment standards analytic efforts.

Another screen racilitated inclusion of those cases for which there was clear indication of their eligibility to reenlist (ELGREUP1 or ELGREUP3). The final screen in setting up the AD data set included only those separated individuals who could be easily identified by "good" or "bad" interservice separation codes (ISC). Observations with separation codes in the "grey" area (death, hardship discharge, entry into officer programs, or medical disqualification) were removed from the data set since it was felt a legitimate determination of their success or failure could not be made.

Eaving incorporated these screens, frequency distritution analysis facilitated the removal of aberrant or
impossible cases. For example, the maximum length of
service between 1 September 1976 and 30 September 1982, the
period of the data base, was 72 months. Cases who were
listed as having greater than 72 months LOS were removed
from the data set.

#### 2. Created Variables

This discussion identifies the variables created in addition to those already in the master data base. Creating these variables facilitated more detailed analysis of cheervations in the AD data set, and enhanced the enlistment standards model development process. The following connects will also address the reasons for selecting some variables and not others.

#### a. Predictor Variables

There were several ways that individuals in the master data base might appear in the AD rating during their

career. They may have enlisted in a program to become an AD, taken the AD rating exam, and/or achieved the AD rating through on the job training. To distinguish between the various combinations of these processes, an entry group variable (ENTRYGEP) was created. Frequency analysis of this new variable confirmed that the final DMDC rate of AD screened and selected only those cases who actually ended up as ADs. An effort was made to develop models for various combinations of these entry groups during stepwise recression analysis. However, the derived models were not significant, and they did not improve upon the models ultimately selected for analysis.

A common predictor variable in enlistment standards models is one dealing with education. The measure in the master data base reflecting education level (HYEC) converted from a qualitative value to a continuous variable (CHYEC) to facilitate statistical analysis. In addition, a dichetereus (0,1) variable was created to reflect attairment cf a high school degree (HSDG). During stepwise analysis, which is discussed in the next chapter, each of these two new variables was offered separately as a candidate predictor variable. In nearly every instance, HSDG was shown to be more significant than CHYEC.

Other counce predictor variables which measure entry-level attributes are ASVAB subtest scores. It allow the use of these measures of individual characteristics, the scores were standardized, and the created variables (SASVABS) were considered during model development. As mentioned in Chapter II, standardized ASVAB subtest scores are used in various combinations as composite measures. One of these composite variables is AFQT percentile (AFQTFCNT), which also yields AFQT groups (AFQTGRPS). Another composite is the score used to determine eligibility for the AD rating. Two variables were created in the AD data set to

The first variable identify this latter composite measure. was a continuous variable which had a creat∈d (ADCOMPOS) value equal to the sum of the four ASVAE standardized subtest scores that make up the composite. The second variable created (ADMINSCR) was a dichotomous variable which distirguished those ACCOMPOS values greater than or equal to 190 from those ACCOMFCS values less than 190. Each time one of these four composite measures was offered as a candidate predictor variable during regression model development, three segarate trials were run. One trial contained the measure and all 12 SASVAB variables. trial cortained the composite variable and only those SASVAB variables that did not make up the composite variable. third trial contained only the composite measure with no SASVAE variables. Additionally, the trials contained either AFOTECNI or AFOTGRPS, and either ADCOMPGS or ADMINSCR. purpose cí this iterative process was to ensure multicollinearity effects were minimized among the independent vari-During the development of the regression models, AFOIFCNI and ALMINSCR were consistently shown to be more significant than AFCIGRPS and ADCOMPOS respectively. this reason, they were included among the final candidate predictor variables used in stepwise regression analysis.

Another predictor variable commonly considered by enlistment standards research deals with marital status and dependents. The master file contains a qualitative variable (METLDPND) which reflects marital status and number of dependents. This study created a dichotomous variable (DEFFNDIS) which distinguishes single individuals from those who are married and/or who have children. Again an iterative process revealed this created variable to consistently the more significant.

The effects of race and sex were also considered in the analysis by creating new variables. The best

variable in the master file to indicate race and ethric status identified categories of whites, blacks and others (RACE). Since this variable was qualitative, three dumny variables were created (WHITE, BLACK, and OTHER). Ic allow analysis of the effects of sex, the master file variable (SEX) was converted to a "0,1" variable (NUSEX).

Several other predictor variables were considered and tested for significance and possible inclusion in the final set of cardidate predictor variables prior to developing the regression models. Age at enlistment (ENTRYAGE), enlistment paygrade (ENTRPAYG) and term of enlistment (TERMENLT) were among those selected. Many variables were rejected because other measures were better able to carture the desired effects. One particular variable show to be significant was the composite which did not SCREEN variable (SCREEN) discussed in Chapter II. This say te because the components of the SCREEN variable are individually more appropriate for analysis, particularly when the emphasis is on predicting operational performance in the fleet. Similar results were cited by McGarvey [Ref. 10].

The final set of predictor variables created in the AI data set are interaction terms. These variables represent all two-level interactions of the seven variables that met the specified significance level during sterwise regression analysis. The development of these variables is discussed in more detail in Chapter IV.

#### t. Criterior Variables

1

As discussed in Chapter II, this study used two criterics variables when developing the six models—length of service measures and success measures. The length of service measure for regression models is a continuous variable (TAFMS1), and for discriminant models is a dichetemous

variable (SUCCTAF). SUCCTAF was assigned a value of 'one' if the value of TAFMS1 was greater than or equal to 48 months, or if the value of TAFMS1 was greater than or equal to 45 months and the individual entered the Navy in October, November or December 1978 (LATEENLT). This was done to ensure those cases who did not have the opportunity to serve 48 months were not improperly classified as failures.

Individuals were considered as successes, for purposes of this analysis, if they served 48 months or longer, achieved paygrade E-4, and were recommended for reenlistment. Again, observations who did not have the apportunity to serve 48 months were also considered successful on the ICS portion of this criterion if they served at least 45 months. The success criterion variable (SUCCESS2) captures these measures by considering SUCCEAF and two other created variables (SUCCPAYG and SUCCEEUF).

SUCCPAYG identifies those cases who achieved E-4 as measured by two created variables (PAYGRADE and NUHYFAY). FAYGRADE was created from one of two DMDC variables (PAYGRDE1 or PAYGRDE3) that measure an individual's paygrade at the last file update or upon discharge from the service, as appropriate. NUEYPAY was created by converting an NERC variable (HYPAYGRD) from a categorical to a numeric variable. Using both DMTC and NHRC measures of paygrade ensured correct classification of an individual on this portion of the criterion.

SUCCREUP, the eligibility to reenlist portion of the success criterion, was derived from the DMDC variable (ELGREUF1) that captured the reenlistment code assigned upon an individual's discharge from the service. Service members on active duty as of the last master file update were considered eligible to reenlist, as long as there was no

<sup>&</sup>lt;sup>2</sup>Liscriminant analysis requires the use of categorical vice continuous variables as classification variables.

cther information to the contrary. The next chapter will discuss how the information contained in the AD data set was specifically evaluated using three separate statistical analysis techniques.

#### IV. STATISTICAL ANALYSIS

Three distinct statistical methods were employed in this research: Descriptive Analysis, Regression Analysis and Discriminant Analysis. All methods used Statistical Analysis System (SAS) procedures to analyze the data and develor the models. Table I contains a list of the candidate rredictor/discriminating variables used in this study. In all, six sets of variables emerged, and each set was aralyzed using both regression and discriminant techniques for comparison. These six sets of discriminating variables are shown in Table II, along with the appropriate criterion/classification variable. along with the results, are discussed in the following sections of this chapter. It is worth noting that, while the results may not represent a marked improvement over the selection process in use when individuals in the data set enlisted, the methodology presented may be appli€d to further analysis of the AD rating or to any other rating in the Navy.

#### A. CESCRIPTIVE ANALYSIS

Descriptive analysis was accomplished through review of frequency distributions, summary statistics and multivariate correlations.

#### 1. Frequency Analysis

frequency distributions are summary tables in which data are grouped or arranged into conveniently established numerically ordered classes or categories. The process of data analysis is, therefore, made much more manageable and

TABLE I

Candidate Predictor/Discriminating Variables

Variable Label AFOT FERCENTILE (CR EQUIVALENT) AFOT EFOURS (5,4C,4B,4A,3B,3A,2,1) AGE OF INCLVIDUAL AT TIME OF FNTRY AFCIFCNT AFCIGRES ENIFYAGE AGE OF INDIVIDUAL AT TIME OF FATRY
ENTRY FAYGRAGE (EO -- O11)
TERM CF ENLISIMENT (NO. OF YEARS)
HIGH-SCHOOL GRADUATE(1) V. CTHER (O)
SINGLE, NO DEPENDENTE (O). CTHERWISE (1)
CONVEFIED NUMERE OF YEARS OF EDUCATION
STANDARDIZED SCORE - GENERAL INFORMATION
STANDARDIZED SCORE - NUMERICAL OPERATIONS
STANDARDIZED SCORE - ATTENTION TO DETAIL
STANDARDIZED SCORE - WORD KNOWLEDGE
STANDARDIZED SCORE - SPACE PERCEPTION
STANDARDIZED SCORE - SPACE PERCEPTION
STANDARDIZED SCORE - SPACE PERCEPTION
STANDARDIZED SCORE - ELECTRONIC INFO ENTERAIG TERMENIT ESCC CEPENCIS CHYEC SASVAEGI SASVAENO SASVAENO SASVAENK SASVAENK SASVAEAR SASVAEEK STANDAFIZED SCCEE - MATH KNOWLEDGE
STANDAFDIZED SCCRE - ELECTRONIC INFO
STANDAFIZED SCCRE - MECH COMPREHENSICN
STANDAFDIZED SCCRE - GENERAL SCIENCE
STANDAFDIZED SCCRE - SHOP INFORMATION
STANDARDIZED SCCRE - AUTO INFORMATION
(1) BLACK, ELSE (0)
(1) NEITHER ELACK NOR WHITE, ELSE (0)
(1) MAIE, (0) FEMALE
AL ASVAB COMPOSITE
AL ASVAB COMPOSITE SCREEN
DEPENDIS \* HSDG SASVAEEI SASVAEMO SASVAECS SASVAESI SASVAEAI DEPENCIS \* H SDG DEPENLIS DEPENLIS DEPENLIS \* BIACK \* NISEX \* TERMENIT DEPENIIS \* TERME
DEPENIIS \* SASVA
DEPENIIS \* ALMIN
HSDG \* BLACK
HSDG \* NUSEX
HSDG \* TERMENLI
HSDG \* SASVAEAL
HSDG \* ADMINSCR
BLACK \* NUSEX
BLACK \* TERMENLI \* SASVABAI \* ALMINSCR INTERICINTERIC INTER 13 BIACK BIACK NUSEX INTER 14 INTER 15 INTER 16 SASVAEAI ADMINSCE TERMENIT SASVAEAI INTER 17 NUSEX INTER 18 INTER 19 INTER 20 ADMINSCF \* SASVABAI NUSEX TERMENIT \*
TERMENIT \*
SASVAFAI \* INTER21

meaningful. In this study, frequency analysis was performed to provide counts and percentage distributions of individuals in the sample, and to illustrate the range of the predictor and criterion variables. This information provided a base upon which to screen aberrant observations and to compare the results of this study. Frequency distributions are provided in Appendix B for the AD rating.

TABLE II
Selection Models

Mcdel	Predictors/ Discrimirating Varialles	Regression Criterion Variable	Discriminant Classification Variable
A	CEPENCTS IFEMENL ADMINSOR BEDGE FLACK CIHER NUSEX	T TAFMS 1	SUCCTAF
E	TERMENLT INTEROSINTER C4 INTEROSINTER 14 INTER 21		SUC CIAF
С	INTERC3 INTEROS SASVAEWK ENTEPAY	G TAFMS 1	SUC CTAF
ľ	CEPENCTS HSDG CTHER TERMENL SASVAEAI SASVABW	SUCCESS2 I	SUCCESS2
F	INTERO3 INTERO9	SUCCESS2	SUCCESS2
F	INTER 03 INTER 09 INTER 21 CIHER SAS VAEEL SAS VABN SAS VAESI AFÇTGRP CHYEC	K	SUCCESS2

Note: Variable sets A, E, E and E resulted from stepwise regression techniques. The variable sets C and F resulted from stepwise discriminant techniques.

Table I provides the labels for these variables.

#### 2. Summary Statistics

like frequency distributions, descriptive summary statistics are useful for analyzing and interpreting quantitative data. These summary statistics represent properties of location, dispersion and shape, and may be used to extract and summarize features of the data set. Representative summary statistics for variables in the AD data set are shown in Table III.

TABLE III
Selected Summary Statistics

VABIAELE	MEAN	SIANDARD DEVIATION	MINIMUM VALUE	EAXIMUM VALUE
TESTAGENCE	42894329144870699 398900889109901119 441455489110901119	2 0.4210818918448139 0.5177976876878909	6.27.03.000000000000000000000000000000000	00000000000000000000000000000000000000

#### 3. Eultivariate Correlation Analysis

Measuring the strength of the relationship between variables may be accomplished by correlation analysis. This technique enables one to gain an idea of the degree of association or covariation that a variable has with another variable. The summary measure that expresses the extent of this relationship is the coefficient of correlation, r, whose values range from -1 for perfect negative correlation to +1 for perfect positive correlation. Values close to zero indicate little systematic covariation between two variables. Correlation coefficients for quantitative variables used in this study are contained in Appendix B.

Assessing the strength of association between variables does not allow a researcher to predict the value of one variable from the value of another variable. The latter involves regression techniques, and is presented in the next section of this study.

#### E. REGRESSION ANALYSIS

Regression analysis is one method used to develor a statistical model that can predict the values of a dependent or response variable based on the values of independent or explanatory variables. Rather than merely measuring the association between variables with correlation analysis, a regression model attempts to predict or explain the value of the criterion variable by developing an equation that is based on weighted values of one or more predictor variables.

In developing the selection models in this study, the process employed was to first apply a variable "search" procedure called stepwise regression. The resultant models were ther analyzed by simple regression analysis, and validated against a hold-out sample of the data set. The details of this process, the specific models derived, and results of the analysis are reported in the following sections. Appendix C contains a discussion of regression analysis assumptions and methodology.

#### 1. Sterwise Regression

Che of the desired characteristics of a regression model is parsimony, which means including the least number of explanatory variables that permit adequate interpretation of the dependent variable of interest. Such models are easier to interpret and are not as likely to be affected by multicollinearity problems. In developing the models for this study, stepwise regression procedures were employed to find a "best" combination of predictor variables, thereby avoiding the computationally complex and costly process of examining all possible regressions.

Rulticcllinearity refers to the condition in which some of the independent variables are highly correlated with each other. When multicollinearity is present, the values of the regression coefficients for the correlated variables may fluctuate dramatically.

In this study, two sets of candidate predictor variables were analyzed with the stepwise procedure. The first set included those entry-level attributes and measures that were considered likely to be good predictors of each criterion, hased on a review of similar enlistment standards studies. As discussed in Chapter II, these variables included individual and demographic measures such as mental ability, amount of education, entry age, entry paygrade, marital status, AFQT percentile, and ASVAB scores. Table IV provides a list of the 18 candidate variables from the AD data set that were used in the stepwise procedure.

The second set of candidate predictor variables included the seven variables from the first set that met the specified significance level for inclusion in the stepwise model. In addition, this set included all two-level interactions of these seven variables. Inclusion of interaction terms in this study represents a marked departure from previous enlistment standards research. The results of this analysis clearly indicate the presence of interaction effects among predictor variables. The seven predictor variables and 21 interaction terms used in the stepwise analysis are also contained in Table IV.

Esing these two sets of candidate predictor variables, the stepwise procedure was run on each of the two criterion variables, TAFMS1 and SUCCESS2, which were defined in Chapter III. The resulting four models were developed from a uniform random split, the derivation sample, of 1440 observations in the AD data set. This derivation sample constituted approximately half of the 2820 total cases in the AD data set. So doing facilitated cross-validation of

An interaction involves the product of two or more independent variables, and is included in a regression model when the relationship between one independent variable and the dependent variable changes for differing values of another independent variable [Ref. 11].

# TABLE IV

### Predictors in Sterwise Regressions

Variable

Label

#### -- FIRST SET --

AFCIPCNI - AFOI FERCENTIIE (CR EQUIVALENT)
ENTRYAGE - AGE CF INDIVIDUAL AT TIME OF ENTRY
ENTREAYG - ENTRY PAYGRADE (EO--O11)
TERMENIT - TERM CF ENLISTMENT (NO. OF YEARS)
ESLC - HIGH-SCHOOL GRADUATE(1) V. OTHERWISE (1)
ESLC - SINGLE, NO LEPENDENTS (0), OTHERWISE (1)
EASVAEGI - STANLARDIZED SCORE - GENERAL INFORMATION
SASVAENO - STANLARDIZED SCORE - NUMERICAL OPERATIONS
SASVAENO - STANLARDIZED SCORE - WORD KNOWLEDGE
SASVAEWK - STANLARDIZED SCORE - WORD KNOWLEDGE
SASVAEWK - STANLARDIZED SCORE - WORD KNOWLEDGE
SASVAEST - STANLARDIZED SCORE - MECH COMPREHENSION
SASVAEMC - STANLARDIZED SCORE - MECH COMPREHENSION
SASVAESI - STANLARDIZED SCORE - AUTO INFORMATION
ELACK - (1) ELACK, ELST (0)
CTELE - (1) HALE, (0) FEMALE
ADMINSOR - AD ASVAB COMFOSITE SCREEN

#### -- SECCED SET --

THRMENIT - TERM CF ENLISTMENT (NO. OF YEARS)
ESCE - HIGH-SCHCOL GRACUATE(1) V. OTHER (0)
EFFENDIS - SINGIF, NO DEPENDENTS (0), CTHERWISE (1)
EASVAFAI - STANIARDIZED SCORE - AJIO INFORMATION
HIACK - (1) HIACK, FISE (0)
HIACK - (1) HAALE, (C) FEMALE
ADMINSOR - AD ASVABB COMECSITE SCREEN
INTERCO1 - DEPENITS \* HELACK
INTERCO2 - DEPENITS \* NUSEX
INTERCO3 - DEPENITS \* NUSEX
INTERCO4 - DEPENITS \* ALMINSOR
INTERCO5 - HSDG \* BLACK
INTERCO6 - LEPENITS \* ALMINSOR
INTERCO7 - HSDG \* BLACK
INTERCO8 - HSDG \* ADMINSOR
INTERCO8 - HSDG \* ADMINSOR
INTERCO9 - TERMENIT \* SASVABAI
INTERCO9 - TERMENIT \* SASVABAI
INTERCO9 - TERMENIT \* ADMINSOR

the mcdels against a hold-out sample, the validation sample, whose characteristics would not influence the cricinal

development of the models. The predictor variables that remained in the model at the termination of the stepwise procedure were significant at  $\underline{p} < .10$ , and most variables were significant at  $\underline{r} < .05$ . The four models themselves were significant at  $\underline{r} < .00$ C1.

#### 2. Multiple Regression

The four models developed by the stepwise process were rext analyzed using the SAS Regression procedure to describe the particular straight line model that lest fit the data. Table V contains the printed output from the SAS Regression procedure that was run on each of the four models. For comparative purposes, two models developed by discriminant analysis techniques, discussed in the next section of this chapter, are also shown in table V. The <u>SAS User's Guide</u> provides a detailed description of the statistics that are included in the tables, as well as their method of computation [Ref. 12]. It can be seen that Model E, with the highest E-SQUARE and all variables statistically significant, is the preferred regression model.

The proportion of variation in the criterion variable explained by the set of predictor variables selected is called the coefficient of multiple determination, The values of R-SQUARE for the mcdels denoted F-SCUARE. developed in this study are relatively low. This rartially attributable to the large number of observations in the AL data set. However, it is also likely that the variation of the criterion variable, length of service or success as defined in this study, is also due to factors not captured by the entry-level attributes and measures used as rredictor variables. These factors, which affect an individual's performance and decision to remain in the service, present themselves subsequent to enlistment. include satisfaction with initial assignment, geographical

TABLE V
Regression Analysis Results

Model	Predictors	Parameter Estimates	Frob >  I	R Squar €	F Value
A	INTERCEPT LEFENDTS TERMENLT ALMINSCR ESLG CIEER NUSEX ELACK	29.049 2.841 3.639 -1.207 1.807 2.254 4.171 1.729	0.0001 0.0636 0.0001 0.0260 0.036 0.0294 0.0079	0.0537	11.613
В	INTERCEPT TEEMENLT INTERO3 INTERO4 INTERO8 INTER14 INTER21	3.890 15.724 -2.937 2.113 0.032 -0.024	0.0001 0.0001 0.0026 0.0173 0.0004 0.0398 0.0134	0.0547	13.828
С	INTERCEPT INTERO3 INTERO8 SASVABWK ENTEPAYG	51.746 3.888 2.137 -0.101 0.416	0.0001 0.0163 0.0004 0.0022 0.3685	J. 022J	E.0E9
D	INTERCEPT LEPENDTS TERMENLT ESDG CTEER SASVABAI SASVABWK	0.535 0.053 0.115 0.080 0.001	0.0002 0.0131 0.0549 0.0001 0.0871 0.5630 0.1028	J <b>.</b> 0255	6.238
E	INTERCEPT INTERO3 INTERO9	0.663 0.196 0.030	0.0001 0.0064 0.0001	0.0193	14.501
F	INTERCEPT INTERO3 INTERO9 INTER21 CTEER SASVABEI SASVABSI CHYFC AFCTGRPS	0.565 0.202 0.038 -0.001 0.101 0.006 0.002 -0.033 -0.027	0.0309 0.0053 0.0001 0.0576 0.0297 0.0022 0.1456 0.1138	0.0370	6.107

location of duty assignment, command climate, unit employment, change in marital status, societal values and pressures, and educational and economic opportunities outside the military. These factors or measures are post how considerations that are not available when screening candidates for enlistment and initial rating assignment. They

are issues that are appropriate for more sophisticated methcdologies, for example, covariance structure analysis which can treat complicated enlistment standards models as a series of simultaneous equations that capture performance as a "multiple-stage" process occurring throughout an individual's military career. [Ref. 10]

# 3. Validation

The results of the regression procedure were next validated against the hold-out sample. Each of the regression models was derived from a uniform random sample, the derivation sample, of the observations in the AD data set. The SAS Regression procedure was employed to calculate the parameter estimates for the associated predictor variables using data from observations in this derivation sample. The SAS Score procedure then used these estimates to predict the value of the criterior variable for each observation in the validation sample. Finally, these predicted values were correlated with the actual values of the criterion in the validation sample. These correlations represent the validation coefficients for each model, and are shown in Table VI.

TABLE VI
Regression Model Validities

Mcdel	First Validity	Second Validity	Average
	Coefficiert	Coefficient	Validity
A E C E F	0.21342 0.21536 0.14459 0.17387 0.17790 0.14430	0.20317 0.21683 0.13612 0.13766 0.12751 0.13531	0-21 0-14 0-16 0-14 0-14

Note: The First Validity Coefficient is the result of the cross-validation, and the Second Validity Coefficient results from the double cross-validation. The reported average is the simple arithmetic mean.

As a further check of the validity of the six regression models, the process was repeated by deriving parameter estimates from the validation sample, and using these estimates to correlate the actual and predicted values of the criterion for observations in the derivation sample. This double cross-validation technique is described in detail by Campbell [Ref. 13]. Table VI also contains this second set of validity coefficients for the six models.

Cocasionally, concern is expressed that random samples may not be from a homogeneous population, and, therefore, the sample correlations may differ from the population correlations. One method of addressing the problem of heterogeneous samples is to average the correlation coefficients to obtain a single estimate of the population correlation. If the sample correlations are of about the same value and if they are not too large, as is the case with this study, this simple arithmetic mean will suffice. Were this not the case, however, another technique is to use transformations to Fisher's z coefficients. [Ref. 14] The simple arithmetic average correlations are also presented in Table VI. Appendix C contains the program used to calculate validity coefficients.

# C. DISCEIMINANT ANALYSIS

The third statistical method employed in this research was discriminant analysis. The use of discriminant analysis allows observations to be classified into two or more groups or categories on the basis of one or more numeric variables. As was done with regression analysis, the discriminant models were derived and analyzed from the derivation sample of the data set, and tested against the hold-out sample of observations. Variables in the model were again selected using stepwise techniques. The resulting two models, and

the four models developed by regression analysis, were then analyzed using the SAS Discriminant procedure. The program used in this analysis is contained in Appendix D, along with a discussion of discriminant analysis assumptions and methodology.

# 1. Sterwise Discriminant Analysis

The SAS Sterwise Discriminant procedure was employed to select the most useful discriminating variables. It is a logical and efficient method of choosing an optimal combination of variables. Their selection to enter or leave the model is based on either the significance level of an F test or a squared partial correlation criterion. The selected variables are those which contribute most to the discriminatory power of the model. [Ref. 12]

The variables chosen by the stepwise discriminant process were selected from the 46 candidate variables shown previously in Table I. The entry-level attributes and measures that were considered likely to be good predictors, as discussed in Chapter II, represent 25 of these candidate variables. The other 21 variables are the two-level interaction terms considered during regression analysis of the AD data set. The procedure was run on each of the two criterion variables, SUCCTAF and SUCCESS2, discussed in Chapter III. The criterion variables define the groups into which each observation will be classified by discriminant analysis, and are called classification variables.

# 2. Liscriminant Analysis

As previously mentioned, discriminant analysis involves the study of differences between two or more groups, defined by a single nominal level variable, with a set of common discriminating variables.

The SAS Discriminant Analysis procedure provided the means for conducting discriminant analysis of the AD data set. The procedure was run on each of the six models developed by stepwise regression and stepwise discriminant processes. Each observation is placed in the class from which it has the smallest generalized squared distance. Also taken into account were the prior probabilities of group membership. These probabilities are obtained from a frequency distribution of actual successes and failures of the sample data set. This was considered appropriate since this study is attempting to improve upon the selection process in use at the time the individuals enlisted.

Table VII contains the results of discriminant analysis. Each procedure incorporated the prior probability of group membership, indicated on the classification matrix as FRICES. The classification matrix is divided into four elements which depict the number of actual (row) versus predicted (column) classifications into successful (1) or failure (0) groups. The four elements (actual, predicted) in the matrix are:

- (0,0) The number of failure cases predicted to be failures
- (1,0) The number of successful cases predicted to te failures
- (0,1) The number of failure cases predicted to be successful
- (1,1) The number of successful cases predicted to te successful

Fach section first cortains the classification matrix developed by applying the classification function to the derivation sample. The second classification matrix depicts the results of applying this same classification function to observations in the hold-out sample, thereby validating the model.

The table also shows two rates relevant to each classification matrix. The first rate is the percentage of correct classifications, called the "hit rate", which provides a measure of the accuracy of the discriminant model. The second rate is the percentage of enlistees who were classified as (1,1) compared to all cases who were predicted as successful. It is called the "success rate", and it provides a measure of how well this selection model would have performed. It may be compared to the criginal selection strategy success rate, the priors. Success rate is an important consideration with utility analysis, and will be addressed further in Chapter V. As with regression analysis, Model B is again the preferred model since it is the only one that improves upon the selection strategy in existence during the timeframe of the AD data set.

To illustrate how the results may be interpreted, an example of the classification matrices for Model A will be explained. The model correctly classified 49 observations as failures and 1079 observations as successful. The sum of these correct classifications represents 79 percent of the total of 1440 observations in the derivation sample. To test the model's accuracy, the classification function is applied to the validation sample. The second classification matrix indicates 47 failure and 1039 successful observations were correctly classified. The sum represents a hit-rate of 79 percent of the total of 1380 observations in the hold-out sample. The consistency of these hit-rates indicates the model is valid. The model betters the 85 percent success rate experienced by the Navy with the selection process used at the time the observations enlisted.

However, it is difficult to significantly improve upon such a high success rate. Additional entry-level attributes and measures might be found to better capture success as defined in this study. An alternate approach

would be to redefine the success criterion. In either case, however, the methodology presented in this chapter may be similarly followed to develop and test enlistment standards models. The next chapter will discuss a method by which the utility of such an effort may be measured.

TABLE VII
Discriminant Analysis Results

rodel	Ēri	crs 1	Classification Matrix				Hit Rate	Succ∈ss Rat∈	
A	0.15	0.85			Fred SUCC	icted TAF		0.78	0.87
					C	1	Total		
			Actual SUCCIAF	0	49	16 1	210		
	SUCCIAL	1	151	1079	1230				
			Iotal		200	1240	1440		
					Pred SUCC	icted TAF		0 <b>.7</b> 9	38.0
					0	1	Total		
			Actual SUCCIAF	0	47	136	183		
			SUCCIAR	1	158	1039	1197		
			Total		205	1175	1380		
В	0.15	0.85			Pred SUCC	icted TAF		0.85	0.85
					0	1	Total		
			SUCCIAF	0	1	209	210		
				1	2	1228	1230		
			Total		3	1437	1440		
					Pred SUCC	icted TAF		0.87	0.87
					0	1	Total		
			Actual SUCCIAF	0	0	183	183		
			LUCCIRI	1	1	1196	1197		
			Total		1	1379	1380		

Model	Fricrs	Cla	.ss	ificat	ion Ma	trix	lit Rate	Success Rat€
С	0.15 C.85			Pred SUCC	icted TAF		0.83	0.86
				0	1	Total		
	•	Actual SUCCIAF	0	15	195	210		
		SUCCIAR	1	46	1184	1230		
		Total		61	1379	1440		
				Pred SUCC	icted TAF		D.83	0.87
				C	1	Total		
		Actual SUCCIAF	0	8	175	183		
		SUCCIAR	1	€2	1135	1197		
		Total		70	1310	1380		
D	0.23 C.77			Pred SUCC	icted ESS2		J.36	0.86
				0	1	Total		
		Actual SUCCESS2	0	3 <b>C</b> 2	35	33 <b>7</b>		
		SUCCESSZ	1	889	214	1103		
		Total		1191	249	1440		
				Fred SUCC	icted ESS2		J.35	0.84
				0	1	Total		
		Actual SUCCESS2	0	277	4 1	318		
		SUCCESS2	1	ε <b>50</b>	212	1062		
		Total		1127	253	1380		

Mcdel	Fricrs C 1	Cla	ss i	ficat	ion Mad	rix	Hit Rate	Succ∈ss Rat∈
E	0.23 0.77			Fred SUCC	icted ESS2		0.70	0.79
				C	1	Total		
		Actual SUCCESS2	0	95	242	337		
		SUCCESSZ	1	187	916	1103		
		Total		282	1158	1440		
				Fred	icted ESS2		<b>).7</b> 2	0.79
				C	1	Total		
		Actual SUCCESS2	0	112	206	318		
		SUCCESS2	1	174	888	1062		
		Total		286	1094	1380		
F	0.23 0.77			Fr∈d SUCC	icted ESS2		J.55	C-85
				C	1	Total		
		Actual SUCCESS2	0	238	99	337		
		30001232	1	554	549	1103		
		Total		<b>7</b> 92	648	1440		
				Fred	icted ESS2		3.50	C-82
				C	1	Total		
		Actual SUCCESS2	0	2 18	100	318		
		20001232	1	591	471	1062		
		Total		809	571	1380		

# V. UTILITY ANALYSIS

This chapter cortains an explanation of the applicability of utility analysis to the development of selection procedures, and discusses the theory of utility analysis. The methodology used in this study to apply utility analysis is described, along with sections on the calculation of cell probabilities for regression and discriminant models, and a section on estimating cell utilities. More detail on the calculations and programs used for utility analysis may be found in Appendix E.

## A. FUEFCSE OF UTILITY ANALYSIS

The development of a model for use in predicting an applicant's future performance in a particular job is a very necessary part of most selection procedures. However, model itself does not constitute enough information to enable a decision to be made on whether or not it is worth implementing. The validity of the model is one indicator of its retential usefulness but, as will be seen, other factors significantly affect the usefulness of a model. All crearizations would find it valuable to be able to judge the worth of their strategy in quantitative terms, particularly when comparing their existing strategy to a newly developed, competing strategy. A framework is needed which will allow the evaluation of a selection model in terms of the institutional gains (or losses) that are expected to result when that model is used to quide decisions on selection. Classical utility analysis provides such a framework, and it allows the calculation of usefulness to be made in terms of actual dellars, which facilitates the comparison of one selection model with another.

## E. TEECEY OF UTILITY ANALYSIS

In the context of utility analysis, there are four cutcomes of interest associated with selection decisions. These cutcomes are:

- <u>Valid Positives</u> (<u>VP</u>), which refers to the number of applicants that are bired and who turn out to he successful on the job.
- <u>False Positives</u> (<u>FP</u>), which refers to the number of applicants that are hired and who turn cut to be unsuccessful on the job.
- <u>False Negatives</u> (<u>FN</u>) are the people who were not hired, but who would have been successful if they had been hired.
- <u>Valic Negatives</u> (<u>VN</u>) are the people that were not hired, and who would have been unsuccessful if they had been hired.

It is chvicus from the terminology and the explanations that VP and VN constitute correct selection decisions, and FP and FN represent selection error.

These cutcomes are perhaps easier to understand with the aid of a diagram. Figure 5.1 shows the relationship between hypothetical predicted (from a model) and actual scores on a job rerformance criterion for a large number of job applicants.

The ellipse contains the data on predicted and actual criterior scores. In this diagrammatic example, the correlation between the predicted and actual scores (the model's validity) is apparent—higher predicted scores are associated with higher actual scores and vice versa. The point y on the vertical axis is the dividing line between what is considered to be successful performance (say completion of 48 months of service for first term enlistees), and unsuccessful performance (less than 48 months service before

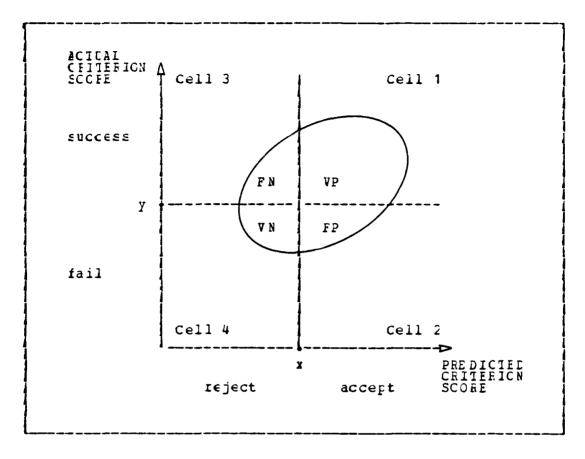


Figure 5.1 Hypothetical Predicted and Actual Sccres

discharge). In utility analysis the term <u>base rate</u> is defined as that projection of current employees who are considered to be successful. If seven out of every ten employees are successful, then the base rate is .70. The point <u>x</u> on the horizontal axis is referred to as the <u>cut score</u>. If an applicant's predicted score (from the model) is greater than <u>x</u>, then that person will be accepted (hired), and if their predicted score is less than <u>x</u>, then they will be rejected (not hired). The location of <u>x</u> on the horizontal axis will often depend on the <u>selection ratio</u>, which is the proportion of applicants that need to be accepted in order to fill a certain number of jobs. If,

cver the course of one year, 80 job vacancies are expected to occur and if 100 applicants over the year are expected to apply for those jobs, then the selection ratio needs to be .80 if all vacancies are to be filled. In the happy circumstance (from the recruiter's point of view) where there are far more applicants than jobs, then the out score x will be chosen so as to maximize the utility of the selection procedure. Utility is defined here to mean the expected gain in dollars that results from a particular selection strategy.

The lines generated from the base rate and the cut score divide the sample into four cells as shown. Each cell contains the people who are classified into each of the four cutcomes of interest. In cells 1 and 2 are people whose predicted score is higher than the cut score. these recrie would be classified as accept. These accepted reople (the positives) are further divided into those who would be successful (valid positives) and those who would be unsuccessful (false resitives). Cells 3 and 4 contain the reorle who scored lower than the cut score on the predictor, and these would be classified as reject. Again, scre of these rejected cases would have been successful (false rejatives), and some would have failed (valid negatives). In utility analysis it is convenient to convert the cell counts (represented by VP, FF, FN and VN) to proportions of the overall sample, so each count is divided by the number of people in the sample and the cell probabilities (PVP. FFP, FFN and PVN respectively) result.

Cre further result of interest is the <u>success</u> <u>rate</u>. The success rate is defired as the proportion of hired applicants who are, or will be, successful. It is simply found by dividing FVF by the sum of FVF and PFP.

Given the concepts and terminology outlined above, it is now possible to discuss in general terms the factors that will affect the cell probabilities which, in turn, affect the expected utility.

# 1. Mcdel Validity

The model's validity, as measured by the correlation between predicted and actual scores, is one factor that determines the degree of selection error resulting from the selection strategy. If the validity is high, then the proportions of correctly classified people (PVP and FVN) will be higher, and the selection error (FFP and PFN) will be lower. Vineberg and Joyner in their review of almost 150 military studies related to job performance prediction, found that validities range from .15 to .40, from a total of 350 validity coefficients [Ref. 15]. Generally, validities within this range would be considered as low or medium.

# 2. <u>Fas∈ Rate</u>

If the existing base rate is high (say .70 or greater), then it means that whatever selection strategy is currently in use has a high rate of success in identifying potentially successful applicants. Under these circumstances, it is unlikely that using a new model in the staffing process would yield much of an improvement in correctly selecting applicants. A high base rate means that the cell probabilities for PVP and PFN are going to be higher than for PFP and PVN.

## 3. Selection Ratio

Assuming the model is valid, the lower the selection ratic, the more useful the model will be in identifying successful applicants. Decreasing selection ratics mean that the organization can be increasingly selective in whom it hires. Naturally, it will tend to accept only those who score highest on the predictor, those who are also predicted most likely to be successful. A low selection ratic (high cut score) will mean that PVF and PFP will be small. It

also follows that a low selection ratio will yield a higher success rate—although few people will be hired, most of them will represent correct selection decisions (PVP).

### C. ESTIPATING THE UTILITY OF A MODEL

The expected utility (EU) of a model is found by summing the products of each cell probability and its associated cell utility (U1, U2, U3 and U4), and subtracting the cost of giving the test to an applicant (UT).

$$EU = C1(PVP) + U2(FFP) + C3(FFN) + U4(PVN) - UT$$
 (5.1)

Appendix E contains detailed descriptions on how cell probabilities and cell utilities are determined. For a discriminant model the cell probabilities may be readily derived from the output of the SAS Discriminant procedure, because the model classifies cases into predicted successes and predicted failures. In the regression model the cut score is not known in advance, so cell probabilities that result from a number of possible cut scores are calculated, and a cut score is eventually chosen based on which set of cell probabilities maximizes the utility of the model.

The formula for calculating the expected utility of a model requires that a utility be assigned to each selection cutcome. These cell utilities are designated U1 through U4 and are associated with the cutcomes VP, FP, FN and VN respectively. The Billet Cost Model provides an estimate of the cost to the Navy of staffing a billet. In this study it is assumed that this cost is equal to the marginal product of a successful sailor, and so the utility of a valid positive (C1) is assigned a value of \$24,163 [Ref. 16]. No proven technique exists for estimating the cell utilities for the three other selection outcomes. Individual

circumstances and prevailing market conditions make it difficult to estimate these outcomes with real confidence, so these cell utilities were estimated relative to U1, and a minor form of sensitivity analysis was conducted. The cell utility of a false positive (U2) was assigned values of -.5, -1 and -2. Valid negatives (U4) were assigned an equal and opposite utility to U2, and false negatives (U3) were assigned values of 0, -.25 and -.5. Table VIII shows seven different sets of cell utilities that were considered.

TABLE VIII
Relative Cell Utilities

U 1	U2	U3	ប 4
1. 0 1. 0 1. 0 1. 0	-0.5 -0.5 -1.0 -2.0 -0.5 -1.0 -2.0	-0.25 0.0 0.0 -0.5 -0.5	0.550 1.00 1.00 1.00

The cost of administering a test (UT) is of significance if the costs of testing are different for competing selection strategies. The models developed in this study use data gathered from the existing tests, and therefore the costs of testing will remain much the same. Thus in this context, UT may be ignored since it applies equally to the old and new tests.

## I. BESUITS OF UTILITY ANALYSIS

Tables IX and X cortain the results of the utility analysis or the regression and discriminant models respectively. The "Percent Change in EU" column is the result of the comparison of the model's utility with the utility of the

Navy's criginal selection strategy (base line utility). positive percentage change in EU indicates that the maximum utility chtainable from the model is higher than the utility of the original selection strategy. An increase in utility of say \$50 means that the Navy saves \$50 for each selection decision (correct or incorrect) that is made by using the model rather than the original strategy. For the models with the SUCCTAF or TAFMS1 criterion, the base rate is .861, i.e., 86.1 percent of the people selected by the Navy were successrul. These recale can be thought of as the valid jositives of the original strategy and the remaining 13.9 percent are false positives. (For the SUCCESS2 criterion figures are 76.8 percent and 23.3 percent.) Unfortunately it is not possible to calculate the values of ard valid negatives so these are considered to be zero. For the TAFMS1 or SUCCTAF criterion then, the cell probabilities for the original selection strategy are FVF = .361, PFF = .139, PFN = 0 and FVN =0. The base line utility for each of the three different combinations of U1 and U2 The model utilities are then can then be calculated. compared to these base line utilities and the differences, expressed as a percentage of the base line utilities, reported. Similarly the base success rate of the original strategy is also .861 (for the TAFMS1 or SUCCIAF criterion). The cclumn "Change in Succrate" reports the actual difference letteen the models' success rates and the base success The column "SRATIO" shows the selection ratio that results when the cut score is chosen so as to maximize the utility, for each set of cell utilities.

# 1. Regression Models

For most sets of cell utilities, the regression models developed show little improvement over the criginal selection strategy. In most cases the selection ratio is

very close to 1 and the percentage increase in expected utility is very small. This is not a surprising result because the model validaties are relatively low (around .20) and, more significantly, the base rates are very high at .861 and .768. It is interesting to note, however, that when the costs of a false positive and the benefits of a valid negative are high, then the selection ratio is driven down, and the utility and success rate go up.

# 2. <u>Fiscrimirant Models</u>

In general the discriminant models did not perform as well as the regression models or the Navy's cricinal selection strategy. For some models the percent change in EU was a significant positive number, but these were usually associated with extreme assumptions of cell utilities. In addition to the factors mentioned in the previous subsection, this poor performance is because the discriminant models lack the flexibility to vary the cell probabilities depending on the values of the cell utilities. There is no option to vary predictions depending on the consequences of correct and incorrect selection decisions, and thus only one set of cell probabilities is available for each discriminant model.

TABLE IX
Otility Results - Regression Models

MCCEL	τ1	IJ2	<b>U</b> 3	υ4	<b>△</b> % EU	Δ SUCCEAT E	
A	1.00	-0.55 -1.00 -1.00 -1.00 -1.00	-C.25 00 -C.5 -0.5	55000500 1.00500	0.14 0.34 5.85 0.11 0.32 1.25	0.001 0.001 0.001 0.022 0.001 0.001	
E	1.00	-0.5 -0.5 -1.0 -0.5 -1.0	-0.25 0 0 -0.5 -0.5	55500500	0.0 0.0 0.0 0.28 0.0 0.0 0.28	0.0 0.0 0.0 0.023 0.0 0.0 0.0	1.0 1.0 1.0 0.8 10 1.0 0.9 85
(	1.00	- C. 5 - O. 5 - 1. 0 - 2. 0 - O. 5 - 1. 0 - 2. 0	-C.25 0 0 -C.5 -0.5	55500500	0.0 0.05 5.79 0.0 0.4	0.0 0.01 0.016 0.0 0.0 0.0	1.0 1.0 0.9 0.8 1.0 1.0 0.9 72
Γ	1.00	-0.5 -0.5 -1.0 -2.0 -3.5 -1.0	-0.25 0 0 -0.5 -0.5	001.00500	0.15 0.22 0.21 72.98 0.03 0.76 35.44	0.002 0.002 0.027 0.074 0.002 0.002 0.014	55513556 99829996 99829998
E	1.00	- C. 5 - 0. 5 - 1. 0 - 2. 5 - 1. 0 - 2. 0	-C.25 0 0 -C.5 -O.5	5500500 12012	0.0 3.51 61.76 0.0 33.51	0.0 0.0 0.033 0.124 0.0 0.0	1.0 1.0 0.7 99 0.0 1.0 1.0 0.7
Ē	1.00	- 0.5 - 0.5 - 1.0 - 0.5 - 1.0 - 0.5	- C. 25 0 0 - 0. 5 - 0. 5	001.00500	0.14 0.16 4.77 79.18 0.11 0.46 36.61	0.001 0.001 0.013 0.063 0.001 0.001	9916 9927 00-5996 00-5996 00-6996
Note:	Ile \$191 -1.0 succi	base u 12 (wh ) and ess ra	tilitie ∈r U2 i \$14061 t∈ is 0	s fcr s -0. (when .861.	Models 5), \$174 U2 is -	A, E and C 28 (when U 2), and th	are - 2 is e tase
	Tie \$157 -1.0 succ	pase u 44 (wh ) and ess ra	tilitie €r U2 i 17326 ( t∈ is 0	s rcr s -0. when .768.	Models 5), \$129 U2 is -2	D. E and F 38 (when U .0), and t	are - 2 is he tase

TABLE X
Utility Results - Discriminant Models

MCIFI	τ1	<b>U</b> 2	U3	04	△% EU	△ SUCCRAF	E SFATIC
A	1.0	-0.5 -0.5 -1.0 -2.0 -0.5 -1.0	-0.25 00 -0.5 -0.5	5500500	-13.0 -5.8 -16.5 -13.8	0.016	0.856
E	1.0	-0.5 -0.5 -1.0 -2.0 -0.5 -1.0	-C-25 0 0 -C-5 -O-5	55500500	-0.1 -0.1 -0.1 -0.2 -0.1	0.0	0.999
C	1.0	-0.5 -0.5 -1.0 -2.0 -0.5 -1.0	-0.25 0 0 -0.5 -0.5	50000000000000000000000000000000000000	-5.0 -3.8 -3.1 -1.0 -6.2 -5.7 -4.3	0.074	C.954
ľ	1.0	-0.5 -0.5 -1.0 -2.0 -0.5 -1.0	-0.25 0 0 -C.5 -0.5	001200000	-86.8 -63.5 -67.5 -110.0 -96.8 -25.3	0.081	0.178
F	1.0	-0.5 -0.5 -1.0 -2.5 -1.0	-C.25 C 0 0 -0.5 -0.5	5500500 120120	-13.3 -83.5 54.6 -18.2 -8.4 33.5	0.033	C.799
F	1.0	-C.5 -0.5 -1.0 -2.0 -C.5 -1.0	-C.25 0 0 -C.5 -0.5	001200 12012	-53.1 -37.5 -15.4 79.4 -68.7 -53.3	0.069	0.432
Ncte:	The \$191 - 1.0 succ	base u 12 (wh ) and ess ra	tilitie er U2 i \$14061 te is 0	s for s -0. (when .861.	Models 5), \$174 U2 is -	A, B and 28 (when 2), and t	C are - U2 is he tase
	Ite \$157 -1.0 succ	base u 44 (wh ) and ess ra	tilitie er U2 i \$7326 ( te is 0	s for s -0. when .768.	Models 5), \$129 U2 is -2	D. E and 38 (when 2.0), and	F are - U2 is the rase

# VI. CONCIUSIONS AND RECOMMENDATIONS

This study set cut to provide a method for developing enlistment standards models which improves upon similar processes presently in use. Toward that end, significant advances have been made, particularly when compared to prior studies conducted at the Naval Postgraduate School. techniques used provide a much more comprehensive approach to mcdel development. They employ regression analysis to fully develop the sterwise regression results. In addition, sterwise discriminant procedures were used to find an cptimal mcdel price to full discriminant analysis. Alternative criteria for measuring successful operational performance, including a continuous length of service criterics, were incorporated in the models. Finally, model was analyzed using both regression and discriminant analysis techniques.

Ferhaps <u>most</u> significant is the presentation of a means by which the benefits from such efforts may be gauged. The development of innovative utility analysis programs affords future researchers ar excellent opportunity to measure in monetary terms the benefits to be derived from implementing a new selection strategy. It is important to reiterate that the statistical and utility analysis techniques presented in this study may be easily applied or modified to accommodate selection standards model development for any of the more than 90 Navy ratings contained in the master data base.

A secondary purpose of this study was to discover whether the models developed improve upon existing selection and assignment strategy for the AD rating. By and large, the models presented do not appreciably enhance the processes used since 1976. The models do, however, allow

che to focus on some specific considerations in the current screening processes. For example, Models A, B, and C allow policy makers to consider length of service in months, and to vary the criterion for measuring success. This capability is particularly appropriate for use in a dynamic recruiting market.

### A. RESUITS

This study yielded several other results worth noting. The term of enlistment variable may be used to predict success now that it has been corrected to reflect active duty chlication. This is particularly important when assessing Naval Reservists, whose six year contract generally requires only three years of active service. The change from a negative to a significantly positive correlation of TERMENLT on the criteria is one of the more important discoveries of this research effort.

This study also determined that the usefulness of the SCREEN composite score in predicting job performance measures was virtually nonexistent. It appears to be more appropriate to use the SCREEN score components in the models, at least when attempting to predict operational job performance. Nontraditional ASVAB subtest scores, such as Auto Information, may also be appropriate for use in the screening process. Another significant finding of this study is the definite presence of interaction effects. Considering personal measures on an individual in conjunction with other measures represents a marked change in current selection practices.

To summarize the results of the statistical analysis, the variables measuring term of enlistment, education, dependents status, sex and race emerged as repeatedly significant predictors of successful operational

performance. The composite measure of eligibility for the AD rating, and the ASVAB Auto Information subtest score, were also significant predictor variables. In addition, Model E was shown to be the best regression and discriminant model.

The results of the application of utility analysis slow that the regression acdels developed in this study perform as well as or better than the original Navy stratecy which was used as the comparison (tase line utility). important to note however, that the methodology used in this rart of the study ensured that regression models will provide a maximum utility at least equal to the lase line utility. This is because the technique allows the cut sccre to be set so low that all cases are accepted. Models A and F are considered to be the best of the models because they provide for significant increases in utility without having to rescrt to impractically low selection ratics. discriminant Models A and E are better than the ctners because improvement over base utility is possible, depending on the cell utilities.

As was mentioned in Chapter V, the high existing base rates are an indication that newly developed models are unlikely to produce superior results. Utility analysis is hindered by the difficulty of confidently estimating the individual cell utilities, and this is an area that is in need of further research. It is also difficult to compare new selection strategies to existing ones because it is impossible to classify the cases rejected by the existing strategy as valid or false negatives. Data of this sort can only be obtained by testing all applicants and then accepting all of them, regardless of their relationship to the cut score, or to the desired selection ratio.

#### E. RECCEMENDATIONS

Despite the advances made by this study, there remains many cyrcrtunities to refine the models presented for the AD rating, and to develop models for other Navy ratings. Frocedurally, these exportunities include testing for curvilinearity of the models, expanding the interaction terms to three or more levels, and seeking different combinations of ASVAE subtest scores as potential predictors. There may also be other measures not evaluated by this study that are significant operational performance predictors, such as enlistment waivers, IEP status, or involvement with civil authorities.

Consideration should also be given to altering the criterion variables. One particularly promising adjustment may be to change the criterion to reflect achieving E-5. This may be appropriate since the models developed appear to do a better job of predicting longer LOS, as indicated by preliminary residual analysis. Developing separate models that yield predictions of shorter LOS may also be in order.

The multiple-stage analytic approach referred to in Chapter IV also appears to be a promising technique. Such analysis might consider change in dependent status, performance evaluations, or advancement exam results as variables in a model.

To improve the usefulness of utility analysis it is important that a technique he developed to estimate cell utilities with reascrable accuracy. Such a technique needs to be able to control for charges in the recruiting market, and he sensitive to the changing Navy requirements for recruits. It is also important that data be gathered on applicants who are not accepted into a particular rating, to allow researchers to determine if they were reclassified to another rating, or rejected entirely.

Ir conclusion, it is clear that continued efforts to develop selection standards models for all ratings are essential. For it is through these efforts that the cost of training and maintaining Navy personnel will be reduced. The resultant experienced career force will ensure the Navy is ready to meet any global commitment.

# APPENCIX A DATA FASE DEVELOPMENT PROGRAMS

This appendix provides the SAS programs used in this study to access the master data base, develop the AD data set, and create new predictor and criterion variables, as discussed in Chapter III. Each program contains the job control language information appropriate to the Naval Postgraduate School's IBM 3033 computer system. Statistical Analysis System (SAS) statements are employed in the programs to accomplish the desired functions. These SAS statements are normally preceded by comments to explain their purpose, the comments being identified by an asterisk.

Table XI cortains the program called "ADSETUP". This program was used to access the master file and extract information on Aviation Machinist's Mates (AD). (The master file tape, originally called "ENLIST", has recently been revised and relabeled "NPS709".) The data file created by this program is called "ADDATA", and it contains the initial 243 variables from the master file. Also provided in the program are the variable names and labels. The program may be used to extract data from the master file for any of approximately 90 Navy ratings simply by entering the appropriate abbreviation and four digit code for the selected rating.

Table XII provides the program called "ADSCREEN" that was used to screen the data extracted from the master file. These screens were performed on observations in the "ADDATA" file, and the results were placed in a file called "ADSCESET". Because of the large number of cases and variables in the data, sufficient computing work space was not available. Therefore, the SAS KEEP statement was used to

retain 116 of the iritial variables for analysis. It was felt these 116 variables captured all the desired measures on the observations that would be required for analysis. The last screen was incorporated following frequency distribution analysis to remove cases that had aberrant or impossible data associated with them.

Table XIII contains the program called "ADNEWVAR". This program was employed to create new predictor and criterion variables, as discussed in Chapter III. The program used information on observations in the "ADSUBSET" data file to create the new variables, and placed the results of these operations in a file called "ADALL4". This file thus constitutes the AD data set referred to throughout this study. It contains all of the selected and created variables that provide information on the 2820 ADs who remained in the data set after all screens were accomplished. It is this file that was used to conduct the statistical analysis for this study.

The "ALNEWVAR" program lists all created variable names and labels. It also contains the SAS statements that converted several qualitative variables to numeric variables or dichetorous (0,1) variables. Finally, the program shows the SAS statement used to split the AD data set into the two uniformly distributed random samples (RANDALL1). These derivation and validation samples were used during regression and discriminant model development described in Chapter IV.

#### TABLE XI

## Frogram to Extract Lata from the Master File

```
//ADDATA JCE (2807.0110). D OSIUND, SMC 1763', CLASS=K
//*MAIN CRG=NPGVM1.28C7P

FXEC SAS
//SAS.WCFK DD SPACE=(CYL,(12,4))
//FILEIN DD UNIT=34CC-5, VOI=SER=ENLIST,
DISF=CIL,DSN=ENLST.ALL.A7678
//FILECUT DD UNIT=333CV, MSV GP=FUB4B, DISP=(NEW,CATLG, DELETE),
DSN=MSS.S28(7.ADDATA,
FCB=(FIKS)72=6400)
                                                                                                                                ICB= (ELKS 12E=640 0)
    SYSIN
CPTICNS
                                                                                     IC *
IS=80 NOCENTEF:
    IATA FILECULADDATA:
                        THIS EFCGRAM EXTRACIS NEAFLY ALL THE VARIABLES FRO MASTER FILE, AND WRITES OUT A FILE TO MASS STORAGE WHICH CONTAINS ALL THESE VARIABLES FOR ALL CASES WHAT ANYTHING TO DO WITH THE "AD" RATING.;
                       THIS
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                     FROM TEE
                                                                       INFILE FILEIN; INFUT
                                                                                                                                                              PIE1.
                                                                                                                                                                                                                                                                                       CENSUSDS
DATEDETY
BIRTHMTH
                                                                                                                                                                                                                                                                                                                                                                                           PIB1.
PIB1.
PIB1.
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LATEDETM
BIRTHDAY
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CENSUSEG=CENSUS REGICN (10 CODES)
CENSUSIS=CENSUS DISTRICT (5 CCTES)
HGMEZIF =HCME OF RECCED ZIP CGDE
HMESTATE=HCME OF RECCED—STATE
LATELETY=YEAR OF FINAL QUALIFYING DETERMINATION
LATELETY=HCAR OF FINAL QUALIFYING DETERMINATION
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EIRIHMIH=CAY OF EIRIH
ENTRYAGI=AGE OF INDIVIDUAL AT TIME OF ENTRY
RECCFILD=RECORD ID—FIXAM SCCRE, DEP, ACTIVE DUTY
EYEC =HIGHEST YEAR OF EDUCATION
EYEC =(1) MALE, (2) FEMALE
ETHNIC =INLIVIDUAL SERPORTEL ETHNIC STATUS
EACEFILN=SIX RACE—ETHNIC COMBINATIONS
ERTLDINC=MARITAL STATUS/DEPINDENTS
TESTFCRM=TEST FORM/ECFA, ASVAB, AFWST, AFQI, OSP...
AFQIFCNT=AFQT PERCENTILE (OF EQUIVALENT)
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AFOTGBES = AFCT GROUPS (5, 4C, 4E, 4A, 3B, 3A, 2, 1)  
ASVAEGE = ASCVAB AFTITUDE AREA SCORE - SUBSCALE NO ASVAENC = ASCVAB AFTITUDE AREA SCORE - SUBSCALE NO ASVAENC = ASCVAB AFTITUDE AREA SCORE - SUBSCALE NO ASVAENC = ASCVAB AFTITUDE AREA SCORE - SUBSCALE NO ASVAENC = ASCVAB AFTITUDE AREA SCORE - SUBSCALE NO ASVAENCE = ASCVAB AFTITUDE AREA SCORE - SUBSCALE SPANNER ASCVABER = ASCVAB AFTITUDE AREA SCORE - SUBSCALE SPANNER NO ASCVADE ASCVAB AFTITUDE AREA SCORE - SUBSCALE STANDARD NO ASCVADE ASCVAD AFTITUDE AREA SCORE - SUBSCALE STANDARD NO ASCVADE ASCVAD AFTITUDE AREA SCORE - SUBSCALE STANDARD NO ASCVADE ASCVAD AFTITUDE AREA SCORE - SUBSCALE STANDARD NO ASCVADE ASCVAD AFTITUDE AREA SCORE - SUBSCALE STANDARD NO ASCVAD ASCVAD AFTITUDE AREA SCORE - SUBSCALE STANDARD NO ASCVAD ASCVAD AFTITUDE AREA SCORE - SUBSCALE STANDARD NO ASCVAD ASCV
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SEPATINT = MCSTH OF SEPARATION (2ND DMDC SECTION)

SEPRETHY = YEAR OF SEPARATION (2NI DMDC SECTION)

EASE TYPE = YEAR OF ACTIVE DUTY EASE DATE

EASE NIE = YEAR OF ACTIVE DUTY EASE DATE

EASE NIE = YEAR OF ACTIVE DUTY EASE DATE

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HISTEIST = ENLISTED HISTORY STATUS
NDAYSE2 = CCMPUTED NUMBER OF DAYS TO E-2 RATING
NDAYSE3 = CCMPUTED NUMBER OF DAYS TO E-3 RATING
NDAYSE4 = CCMPUTED NUMBER OF DAYS TO E-4 RATING
DOLE 1 H = YEAR OF LATEST RE-ENLISTMENT
DOLE 2 H = YEAR OF LATEST RE-ENLISTMENT
DOLE 3 H = YEAR OF LATEST RE-ENLISTED
DOME 5 H = YEAR

\* THIS SCREEN SELECTS ONLY THOSE CASES WHICH HAD ANY AFFILIATION WITH THE 'AD' RATING. THAT IS, THOSE CASES WHICH ARE LISTED IN THE DMIC FILE AS PRESENTLY AD'S (PRETAFRY) OR AS FINALLY AD'S (DMDCRATE), OR AS SIGNING UP FCR AL'S (RCPGSCFT), OR AS HAVING TAKEN THE AD RATING EXAMINATION (EXAMRATE).;

IF CMCCRATE='AD' OR PRRTAERV='AD' OR BCFGSCFT='6200' CE EXAMRATE='6200';

\* THIS NEXT SECTION CLIPUTS EASIC FREQUENCIES TO CHECK THAT THE FATING SPICIFIC DATA HAS BEEN WRITTEN CNTC THE FILE IN MASS STORAGE.;

FROC FFEC DATA = FILECIT. ADDATA:
TAFLES DMDCRATE PRETAERV RCFGSCRT EXAMRATE:
TITLE CEECKCUT FREQUENCIES FROM THE FILE ADDATA.;

/\*/

#### TABLE XII

#### Program to Screen the AD Data

//ADSCREEN JOB (2807,C110), 'D CSLUND, SMC 1763',Class=E
//\*MAIN CEC=NPGVM1.2EC7P
// EXEC SAS.
//SAS.WCFK ED SPACE=(CYL,(12,4))
//FILEIN ID DISP=SHE,DSN=MSS.S2807.ADDATA
//FILECUT DE UNIT=333CV,MSVGF=FUB4A,
// EISP=(NEW,CAILG,EFLETE),DSN=MSS.S2807.ADSUBSET,
// DCE=(BLKSIZE=640C)
//SYSIN ED \*
CPTICNS IS=80 NOCENTEF;

\* THIS PROGRAM RIDUCES THE NUMBER OF CASES IN THE DATA SET BY SCREENING ON CERTAIN VARIABLES. THE INTENT OF THE SCREEN IS SUMMARIZED ABOVE THE APPROPRIATE SAS STATEMENTS;

LATA FILECUT. ADSUBSET; SET FILEIN. ADDATA;

\* THE NUMBER OF VARIABLES IN THE DATA IS REDUCED TO REDUCE THE WORK SPACE REQUIREMENTS.:

KEEF AFÇIGRES AFÇTPCNI AGE ASVAEAR ASVABEI ASVAEGI ASVAENK ASVABNC ASVAESI ANTIFACI ASV ABAD ASV ABGS ASV ABSP ASVAEAI ASVAEMC ASVAEWK ASVABAK ASVABAC ASVABAK ASVABAK ASVABAK ASVABAK ASVABAK ASVABAC AWARACIT ASVABAC ASVABAK ATTATION OF THE ASSTATION OF THE ASS BASOTIDAY

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RACEETHN
REGRESRY SEPRIJDY SERVICE 1 SERVICES SIDNAVY SSNCHNGE TAFMS3 TAFMS1 TAFMS4 TERMENLT TESTFORM TOTOVICK TOTOESRT TOTLAWCL TRENLMOS TCTLLEMO MAIVERAL:

\* THIS SCREEN SEIECTS CNLY THOSE CASES WHOSE FINAL DMIC FATING IS AD:

IF EMDCRATE EQ 'AC';

\* THE FCILCKING LINE SELECTS CNLY THOSE CASES WITH NO PRICE SERVICE. TO FURTHER REMOVE POTENTIAL PRIOR SERVICE CASES THOSE WHO HAVE CHANGED THEIR SOCIAL SECURITY NUMBER ARE ALSO REMOVED FROM THE SAMPLE.;

IF FRICRSRV=1; IF SSNCENGE EQ 0:

\* THE FCILCKING STATEMENTS SELECT ONLY THOSE CASES WEC WERF TESTED ON ASVAF FORMS 5, 6 OR 7. ALSO THOSE CASES WITE PECULIAFLY HIGH ASVAB SCORES ARE ELIMINATED FROM THE DATA SET.;

IF ((IESTFOFM GF 35) AND (TESTFORM LE 37));
IF ASVABGI<=15: IF ASVABNC<=50: IF ASVABAD<= 30:
IF ASVABAR<=20: IF ASVABSF<=20: IF ASVABMK<=20:
IF ASVABGS<=20: IF ASVABSI<=20: IF ASVABAI<=20:
IF ASVABWK<=30: IF ASVABEI<=30: IF ASVABMC<=20:

\* THIS SCREEN ONLY KEEFS THOSE WHO SIGNED UP FOR NAVY OF NAVAL RESERVE.;

IF ((SERVACCS EC 2) OR (SERVACCS EC 8)):

\* ONLY THOSE CASES WEC WERE KNOWN TO HAVE SIGNED UP FOR AT LEAST FOUR YEARS ACTIVE DUTY ARE KEPT.:

IF SECENLST EQ '11';

\* THE CASES ARE SCREENED TO INCLUDE ONLY THOSE WITH "GCCI" CR "BAD" INTERSERVICE SEPARATION CODES, "GREY" CASES ARE ELIMINATED.;

IF ISC 1=0 OR ISC 1=1 OF (ISC 1 GE 60 AND ISC 1 LT 90); IF ISC 3=0 OF (ISC 3 GE 60 AND ISC 3 LT 90);

\* THIS NEXT SCREEN KEEPS THOSE CASES FOR WHICH CLEAR FEITGIELE TO REENLIST DATA IS AVAILABLE.;

IF FIGREUP1=0 OF ELGREUF1=1 OR ELGREUF1=4 OR (FIGREUP1=240 AND (ELGREUF3=0 OR ELGREUP3=1));

\* THESE SCREENS FLIMINATE CASES WITH IMPOSSIBLE DATA .:

IF AFCIGRPS NE 0: IF ICSMNTHS LE 72: IF FACE NE C: IF TAFEST LE 72: IF ENTRYAGE NE 77: IF ENTRYAGE NE 77: IF ENTRYAGE NE 77: IF AFCIPCNT NE 0:

#### TABLE XIII

## Program to Create New Variables

```
//ADNEWVAR JOB (2807,C110), 'D CSLUND, SMC 1763',CLASS=B
//*MAIN CRG=NPGVM1.28C7P
// EXEC SAS
//SAS.%CFK LD SPACE=(CYI,(12,4))
//FILEIN LD DISP=SHE,DSN=MSS.52807.ADSUBSET
//FILECUT LD UNIT=333CV,MSVGP=FUB4A,
// DISP=(NEW,CAILG,LELETE),DSN=MSS.52807.ADAIL4,
// ECE=(EIRSIZE=640C)
//SYSIN LD *
CPTICNS IS=80 NOCENTIF;
        THE PUPPCSE OF THIS PROGRAM IS TO GENERATE NEW VARIABLES FOR USE IN THE ANALYSIS, EITHER BY RECODING ORIGINAL VARIABLES, OR BY CREATING NEW VARIABLES;
 CATA FILECUT. ADAIL4:
SET FILEIN. ADSUBSET:
      THE FCILCWING LINES CREATE DIFFERENT ENTRY GROUPS.

(1) YES YES YES
           1234567
                                                                                              YES
NO
                                                    YES
YES
                                                                                                                                            NO
                                                                                                                                         YES
                                                    Ϋ́ĒS
                                                                                                                                             NO
                                                                                                   NO
                                                                                              YES
YES
                                                        NO
                                                                                                                                         YES
                                                        NO
                                                                                                                                             NO
                                                       ÕK
                                                                                                                                         YES:
                                                                                                  NO
                         (RCEGSCRT='620C' AND EXAMEATE='6200' AND DMDCFATE='AD') THEN ENIEYGRP=1:
(RCEGSCRT='620C' AND EXAMEATE='6200' AND DMLCFATE NE '1') THEN ENTEYGRP=2:
(RCEGSCRT='620C' AND EXAMEATE NE '6200' AND DMLCFATE='AD') THEN ENTEYGRP=3:
(RCEGSCRT='620C' AND EXAMEATE NE '6200' AND DMLCFATE NE 'A1') THEN ENTEYGRP=4:
(RCEGSCRT NE 'A1') THEN ENTEYGRP=4:
(RCPGSCRT NE '6200' AND EXAMEATE='6200' AND DMLCFATE='AD') THEN ENTEYGRP=5:
(RCEGSCRT NE '6200' AND EXAMEATE='6200' AND DMLCFATE NE '6200' AND EXAMEATE='6200' AND DMLCFATE NE '6200' AND EXAMEATE='6200' AND DMLCFATE NE '6200' AND EXAMEATE NE '6200' AND DMLCFATE='AD') THEN ENTEYGRP=7:
             IF
              IF
        IN THIS SECTION, THE DMDC VARIABLE "HYEC" IS CON-
VERTED TO A CONTINUOUS VARIABLE REPRESENTING NUMBER
OF YEARS OF EDUCATION;
                                                     THEN CHYEC=3.5; IF HYEC=2 THEN CHYEC=8;
THEN CHYEC=9; IF HYEC=4 THEN CHYEC=10;
THEN CHYEC=11: IF HYEC=6 THEN CHYEC=12:
THEN CHYEC=13: IF HYEC=8 THEN CHYEC=14:
THEN CHYEC=18: IF HYEC=10 THEN CHYEC=16:
1 THEN CHYEC=18: IF HYEC=12 THEN CHYEC=20;
                        EYEC=1 THEN CHYEC=3.5; I

EYEC=3 THEN CHYEC=9: I

EYEC=5 THEN CHYEC=11: I

EYEC=7 THEN CHYEC=13: I

EYEC=9 THEN CHYEC=15: I

EYEC=11 THEN CHYEC=18: I

EYEC=13 THEN CHYEC=11:5;
              IF
             ΙF
         A NIW CATEGORICAL VARIABLE "HSDG" IS NOW CREATED. A HIGE SCHOOL GRADUATE IS COLED A "1" AND A NON HIGH SCHOOL GRADUATE OR A G.E.C. IS CODED "0".;
                                                                              OF (HYEC EO 13))
ANI (HYEC NE 13))
                                                                                                                                                        THEN HSDG=0:
THEN HSDG=1:
```

THIS SECTION CREATES NEW VARIABLES REPRESENTING STANDARDIZED ASVAB SCORES.:

IF

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IF IF ΙF AS VAEMK = 2 AS VAEMK = 4 AS VAEMK = 5 AS VAEMK = 7 AS VAEMK = 7 IF IF IF THEN THEN THEN SASVAEMK=30: SASVAEMK=32: SASVAEMK=35: THEN THEN THEN THEN SASVAEMK=37 SASVAEMK=39 ÎF IF IF SASVAEMK=491 SASVAEMK=493 SASVAEMK=493 SASVAEMK=497 SASVAEMK=497 SASVAEMK=197 ASVAEMK=8 ASVAEMK=9 ASVABMK=10 ĪF THEN THEN THEN ΙF IF THEN ĪF IF IFF ĪĒ ĪF ĪĒ IF IF ΙĖ HHEENN NANNANATHEEN THEEN THEE THEN THEN THEN THEN THEN THEN THEN THEN IF IF IF IF IF THEN THEN THEN THEN ÎF IF IF THEN THEN THEN THEN IF IF THEN IF IF IF THEN ASVABGS=14 THEN ASVABGS=15 THEN ASVABGS=16 THEN ASVABGS=17 THEN ASVABGS=18 THEN ASVABGS=19 THEN ASVABWK=30 THEN ASVAEAD=0 THEN ASVAEAD=1 THEN ASVAEAD=1 THEN ASVAEAD=2 THEN ASVAEAD=3 THEN ASVAEAD=4 THEN ĪF SASVABGS=65 SASVABGS=66 SASVABAK=64 SASVABAK=20 SASVABAL=20 SASVABAL=221 SASVABAL=21 SASVABAL=24; ĪF IF IFFIF

ASVAEAI=5 ASVAEAI=6 ASVAEAI=7 ASVAFAI= & ASVAFAI= 9 ASVAEAI = 10 ASVAEAI = 11 ASVAEAI = 12 ASVAEAI = 13 ĬĒ ĪF IF ΙF ĪF IF ĪF ΙF ĪĒ ĪĒ ASVAEWK = 8 ASVAEWK = 9 ASVAEWK = 10 ASVABUK = 11 ASVABUK = 12 ASVABUK = 13 ĪĒ ĪĒ IF ÎF

THEN THEN

THEN SASVABAI = 36; THEN SASVABAI = 38; THEN SASVABAI = 40; 

AS VA BAD = 5 AS VA BAD = 6 AS VA BAD = 7 AS VA BAD = 8 AS VA BAD = 10 AS VABAD = 11 AS VABAD = 12 AS VABAD = 13 ÎF IF IF IFFFFF ĪF IFFFFF IFFFFFF ÎF IFFFFFF ĪF ÎF ÎF IF IF ÎF İF ĪF ĪF ÎF ITTITITI

THEN THEN THEN THEN THEN THEN THEN THEEN THE THEEN THEEN THE THEEN THE THEEN THE THEEN TH

SASVAFAL=26; SASVAFAL=29; SASVAFAL=31; SASVAEAL=34: SASVAEAL=34: SASVAEAL=36: SASVABAD=35: I SASVABAD=44: I SASVABAD=44: SASVABAD=46:  The same of the sa

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ASVAENC=12 THEN SASVABNO=31: IF ASVABNO=34
ASVAENC=13 THEN SASVABNO=32: IF ASVABNO=34
ASVAENC=14 THEN SASVABNO=33: IF ASVABNO=35
ASVAENC=15 THEN SASVABNO=34: IF ASVABNO=36
ASVABNC=16 THEN SASVABNO=36: IF ASVABNO=37
ASVABNC=16 THEN SASVABNO=36: IF ASVABNO=38
ASVABNC=17 THEN SASVABNO=37: IF ASVABNO=38
ASVABNC=18 THEN SASVABNO=38: IF ASVABNO=40
ASVABNC=19 THEN SASVABNO=39: IF ASVABNO=41
ASVABNC=20 THEN SASVABNO=40: IF ASVABNO=41
ASVABNC=21 THEN SASVABNO=41: IF ASVABNO=43
ASVABNC=22 THEN SASVABNO=41: IF ASVABNO=43
ASVABNC=22 THEN SASVABNO=44: IF ASVABNO=44
ASVABNC=22 THEN SASVABNO=44: IF ASVABNO=45
ASVABNC=22 THEN SASVABNO=45: IF ASVABNO=45
ASVABNC=22 THEN SASVABNO=46: IF ASVABNO=45
ASVABNC=23 THEN SASVABNO=46: IF ASVABNO=45
ASVABNC=23 THEN SASVABNO=46: IF ASVABNO=45
ASVABNC=26 THEN SASVABNO=46: IF ASVABNO=50
ASVABNC=27 THEN SASVABNO=47: IF ASVABNO=50
ASVABNC=28 THEN SASVABNO=48: IF ASVABNO=50
                                                                                                                                                                               SASVABNO=52;
                                                                                                                      ASVABNO=33 THEN
                                                                                                                                                            HHEN
HHEN
THE
                                                                                                                                                                               SASVABNO=53
SASVABNO=54
SASVABNC=55
ΙF
                                                                                                                                                                               SASVABNO=56;
SASVABNO=57;
SASVABNO=56
                                                                                                                                                            IF
ΙF
                                                                                                                                                                               SASVABNO=59;
SASVABNO=60;
SASVABNO=61
ĪF
IF
                                                                                                                                                                              SASVABNO=623
SASVABNO=645
SASVABNO=665
SASVABNO=667
SASVABNO=667
SASVABNO=668
SASVABNO=688
ĪĒ
ĪF
ÎF
IF
ĬF
                                                                                                                                                                               SASVABNO=69
ΙF
* THE FCILCWING STATEMENTS CREATE THE NUMERIC VARIABLE "LCSMNTHS" FROM THE VARIABLE "INTHSRV".:
          YFAR = SUESTE (LNGTHSFV, 1,2);
MCNTH = SUESTR (INGTHSFV, 3, 2);
          YEARS=YEAR+0:
MCNTHS=MCNTH+C
          LCSMNTHS = YEARS + 12 + CONTHS :
* RECCDING TO A CATEGORICAL VARIABLE.:
          IF METLDEND=10 THEN DEPENDIS=0: ELSE DEPENDTS=1:
* CCNVERTING CHARACTER VARIABLES TO NUMERIC.;
          NUEYFAY=EYPAYGRD+C:
                                                                                     NUNCIFC=NOTRCMD+0:
    TO DIFINE THE HIGHEST PAYGRADE ACHIEVED, ACCORDING TO THE DMIC FILE.;
                   FILEFIG1 = 8209 TEEN PAYGRADE = PAYGRDE1;
FILEFIG1 NE 82CS THEN PAYGRADE = PAYGRDE3;
PAYGRADE = 0 THEN PAYGRADE = PAYGRDE1;
FAYGRADE = 0 THEN FAYGRADE = 1.1;
          İF
    CREATING THE ASVAB COMPOSITE VARIABLE USED WHEN CLASSIFYING AD'S, AND ASSIGNING A DUMMY VARIABLE TO IDENTIFY THOSE WED ACHIEVED THE MINIMUM SCORE
         ADCCMICS = SASVABAF+SASVABEI+SASVABGS+SASVABMK; IF ALCCMICS GE 190 THEN ADMINSCR=1; ELSE ADMINSCR=0;
      SETTING UF DUMMY VARIABLES TO ALLOW ANALYSIS OF BACE AND SEX EFFECTS.;
                                                                                                      FLSE WHITE=0;
ELSE BLACK=0;
FLSE CTHER=0;
FLSE NUSEX=1;
                   FACE = 1

BACE = 2

BACE = 3

SEX = 2
                                                          WHITE = 1;
BLACK = 1;
CTHE = 1;
NUSEX = 0;
                                         THEN
THEN
THEN
         Ī
      CREATING A RANDOM VARIABLE TO ALLOW THE DATA TO BE SELLT FANDOMLY IN HALF:
         IF FAMUNI(O) <= .5 THEN EANIALL1=1: ELSE RANDALL1=0:
```

CREATING INTERACTION VARIABLES FOR USE IN THE MCDEL DEVELORMENT.: INTERC1=LEPENCTS\*HIACK;
INTERC2=LEPENCTS\*HIACK;
INTERC3=LEPENCTS\*NUSEX;
INTERC3=LEPENCTS\*JERMENLI;
INTERC4=LEPENCTS\*ALMINSCHINTERC4=LEPENCTS\*ALMINSCHINTERC6=LEPENCTS\*ALMINSCHINTERC8=HSDG\*HUSEX;
INTERC8=HSDG\*HUSEX;
INTERC9=HSDG\*ADMINSCR;
INTERC10=HSDG\*ADMINSCR;
INTERC10= INTER 21 = SAS VA EAI \* ALMINSC R THE FCILCWING LINES CREATE DIFFERENT CRITERION VARIABLES.; ((SERVICE 1 EQ 2) AND ((FAYGRADE GE 4) AND (NUHYPAY GE 4))) THEN SUCCPAYG=1; EISE SUCCPAYG=C; ENIRYYR=78 AND ENTRYMIH GE 10 THEN LATEEN. FATRYMIH GE 10 THEN LATEENLI = 1; FIRE LATEFALT C;

TAFMS 1 GE 48 OF (TAFMS 1 GE 45 AND LATEFALT = 1)

THEN SUCCTAF = 1; ELSE SUCCTAF = 0;

ELGREUP 1 = 4 THEN SUCCREUP = 0; ELSE SUCCREUP = 1;

SUCCREUP = 1 AND SUCCTAF = 1 AND SUCCPAYG = 1

THEN SUCCESS 2 = 1; ELSE SUCCESS 2 = 0; IABEI

ESDG = HIGH SCHOOL GRADUATE(1), OTHER (0)

CEPENCTS = SINGLE, NC IFPENDENTS (0), OTHERWISE (1)

CHYEC = CCNVERTED NIMBER OF YEARS OF EDUCATION

NUHYEAY = NHEC FILE - FIGHEST PAYGRADE ATTAINED

NUNCTEC = NEGC - NOT RECOMMENDED FOR RE-ENLISTMENT

EAYGFADE = DMEC-BASED FIGHEST PAY-GRADE ATTAINED

SASVAEGLESTANDARRIZEL SCORE - GENERAL INFORMATION

SASVAENC=STANDARRIZEL SCORE - NUMERICAL OPERATIONS

SASVAENK=STANDARRIZEL SCORE - WORD KNOWLEDGE

SASVAHAL=STANDARRIZEL SCORE - WORD KNOWLEDGE

SASVAHAR=STANDARRIZEL SCORE - ARITHMETIC REASONING

SASVAHEK=STANDARRIZEL SCORE - BERCEPTION

SASVAHEK=STANDARRIZEL SCORE - BERCEPTION

SASVAEMC=STANDARRIZEL SCORE - BECCH COMPREHENSION

SASVAEMC=STANDARRIZEL SCORE - BECCH COMPREHENSION

SASVAEMC=STANDARRIZEL SCORE - BENCH INFORMATION

SASVAEMC=STANDARRIZEL SCORE - BENCH INFORMATION

SASVAEMC=STANDARRIZEL SCORE - BENCH INFORMATION

WHITE | 11 BLACK, FISE (0)

ELACK = 11 BLACK, FISE (0)

ELACK = 11 BLACK, FISE (0)

CTHER = (1) MALE, (C) FEMALE

ADDOOMECS=AL ASVAE COMPOSITE

ADMINSCR=AL ASVAE COMPOSITE

ADMINSCR=AL ASVAE COMPOSITE

ADMINSCR=AL ASVAE COMPOSITE

SANDALII = VAR. TO ALICK A RANDOM 50-50 SPLIT

IOSMNTHS=LIENGTH CP SERVICE IN CONTHS

ENTRYGEF=ENTRY GROUP CLASSIFIC ATIONS

LATERIT = ENTERED AFTEF SEP 78 (1), OTHERWISE (0)

SUCCTAF = SUCCESS ON ICS CRITERION (1) IABEI

```
SUCCEAYG = (1.0) SUCCESS ON PAYGRADE
SUCCESS = SUCCESS ON COMPOSITE CRITERION (1)
INTERC1 = LEFENDTS * HSDG
INTERC2 = LEFENDTS * HSDG
INTERC3 = LEFENDTS * HSLACK
INTERC3 = LEFENDTS * TERMENLT
INTERC4 = LEFENDTS * ADMINSCR
INTERC5 = LEFENDTS * ADMINSCR
INTERC6 = LEFENDTS * ADMINSCR
INTERC6 = LEFENDTS * ADMINSCR
INTERC6 = LEFENDTS * ADMINSCR
INTERC6 = LEFENDTS * ADMINSCR
INTERC7 = LESLG * BLACK
INTERC8 = LESLG * NUSEX
INTER 10 = LESLG * ADMINSCF
INTER 11 = LESLG * ADMINSCF
INTER 12 = LIACK * NUSEX
INTER 14 = LIACK * ADMINSCF
INTER 15 = LIACK * ADMINSCF
INTER 15 = LIACK * ADMINSCF
INTER 17 = NUSEX * SASVABAI
INTER 18 = NUSEX * ADMINSCF
INTER 19 = IERMENLT * ADMINSCR;

/*
//*
```

## APPENCIX B CESCRIPTIVE ANALYSIS RESULTS

Frequency distributions and correlations used for descriptive analysis of the AD data set are cortained in Tables XIV and XV.

The frequencies show that 92 percent of the AD data set were 17 to 21 years of age, 79 percent had a high school degree, 97 percent were single, and 98 percent were male. Even though BLACK and OTHER only represented 17 and 6 percent of the sample respectively, their criterion scores were significantly different compared to WHITE criterion scores. Thus, BLACK and OTHER emerged as predictors in some of the models. It is interesting to note that 40 percent of the sample achieved the paygrade E-5. Using achievement of E-5 rather than E-4 in the composite success criterion would produce greater variability on the criterion which may improve the models.

Che third of the cases in the data did not score 190 or greater on the AI composite score. These cases are either reople who were classified prior to correcting the ASVAB Forms 5,6 and 7 misnorming problems, or people who migrated to the AI rating subsequent to service entry. This may partially explain the negative correlations these variables have with the criteria.

TABLE XIV
Selected Frequencies

DECCEATE	FINAL RATING	G AS LISTED CUM FREQ	BY D.M.D.C. PERCENT CUM	PERCENI
AI	2820	2820	100.000	100-000
SCFEEN		SCREEN SCORE		PEFCENT
55665666677777777777888888888889999999 5566566667777777777888888888899999999999	7 35624 053788730569 11220 1	*238128584848384419790565570152038237 111225565568612228999045777777 11225568611218227777777	362968591634829079419274633153292660 7380315016077852434662517777438708431 001102213948218838827887204049511105 000000001112050311266431030045C700000	391075)090680001118880m04140m77705768400 76965911190976919046769194414090447009999999999999999999999999
AFÇIGBES	AFCT GECUPS FFEQUENCY	(5,4C,4B,4E CUM FREQ	A,3B,3A,2,1) PERCENT CU1	PERCENT
שרושועובוחו	4100mmm1 68999403 25755	45549 644949490 12278	0.142 2.163 9.929 21.241 28.191 19.326 17.908	0.145457 0.132776930 13360.900 1360.900 100

```
AGE OF INCIVICUAL AT TIME OF ENTRY FEQUENCY CUM FREQ PERCENT CU1
ENTRYAGE
                                                                                                                                                                                                                                                                                                                          PERCENT
                                                                                                                                                                                                                                                                                                                            13.759
43.440
21.064
                                                                                         80963740011
30501
                                                                                                                                                                    THOUSE INCHAING THOSE
                                                                                                                                                                                                                                               21.38463308330364445
29.42.6339264445
21.797.392883
20.73928845
                                                                                                ENTRY PAY GRACE (E00--011)
QUENCY CUM FREQ PERCENT
                                                                           FREQUENCY
                                                                                                                                                                                                                                                                                               CUM PEFCENT
ENTREAYG
                                                                                                                                                                                                                                         84.220
9.894
5.887
                                                                                        2375
275
166
                                                                                                                                                                    2375
2654
2820
                                                                                                                                                                                                                                                                                                                            84.220
94.113
100.000
                                                                    TERM OF ENLISTMENT (NO. OF YEARS)
FREQUENCY CUM FREQ PERCENT CUM
 TERMENLT
                                                                                                                                                                                                                                        0.035
0.035
95.461
0.035
4.433
                                                                                                                                                                                                                                                                                                                            0.035
0.071
94.567
100.000
                                                                                        2692
                                                                                                                                                                    2694
2695
2820
                                                                                                  125
                                                                           SERVICE OF ACCESSION (NAVY,2) FREQUENCY CUM FREQ PERCENT
 SERVACCS
                                                                                                                                                                                                                                                                                                CU1
                                                                                                                                                                                                                                          96.277
3.723
                                                                                                                                                                                                                                                                                                                              96.277
                                                  2
                                                        CONVERTEL NUMBER OF YEARS OF EDUCATION FREQUENCY CUM FREQ PERCENI CUM
                                                                                                                                                                                                                                                                                        CUM PEFCENT
                      CEYEC
                                                                                                                                                                                                                                                                                                                             0.175.62481
0.175.62481
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                                                                                                                                                                                                                                         0.035
0.142
0.9571
10.9571
10.326
76.773
1.0228
0.390
                                   3.5
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14577090
222222
                                                                                         147 munumumer 1
248 246 222
121 21
2
                             11.100014416
                                                            HIGH-SCHOOL GRADUATE (1) V. OTHER (0) FREQUENCY CUM FREQ PERCENI CU
                           ESDG
                                                                                                                                                                                                                                                                                                                           PERCENT
                                                                                                                                                                      5 E 2
28 20
                                                                                                                                                                                                                                          20.638
                                                                                                                                                                                                                                                                                                                              20-638
100-000
                                                                                         582
2238
```

CEFENCIS SI	NGLE NC CEPEN FRÉQUENCY	TENTS (0)	OTHERWISE ( PERCENT CUM	1) FEFCENT
C 1	2738 82	2738 2820	97.092 2.908	97.092 100.000
NUSEX	(1) MAI FREQUENCY (	CE, (O) FEE	MALE. PERCENI CUM	PERCENT
	_			
C 1	2 <b>7</b> 56	64 2820	97:730	100.000
ENTEYGFF	ENTRY GROUF FREQUENCY (	JP CLASSIF: CUM FREQ	ICATIONS PERCENT CUM	PERCENT
1 3	1 16 6 128	1166 1294	41.348 4.539 46.667	41.348
13.57	1166 128 1316 210	1166 1294 2610 2820	46.667 7.447	41.348 45.887 92.553 100.000
	(1) WHITE, (	(2) ELACK,	(3) OTHER	
FACE	2184		PERCENT CUM	77.447
1 2 3	46 E 16 E	2184 2652 2820	16.596 5.957	94.043 100.000
	AP ACUAD	CCMFCSITE		
ALKINSCE	FREQUENCY (	CUM FREQ		PEFCENT
0	1875	945 2820	33.511 66.489	33.511 100.000
	VAR TO ALLOW	A RANDOM S	50-50 SPLIT	
RANCALL 1	FREQUENCY (	COM FREQ	PERCENT CUM	
9	1380 1440	1380 2820	48.936 51.064	48.936 100.000
ISC3	INTER-SERVI FREQUENCY	CE SEPARAT	TION CODE	PERCENT
0 1 6 C	1106 1495 22 6	26 0 1 26 23	53.014 0.780	92.234
61 63	6 1	2629 2630	0 - 2 13 0 - 0 3 5	93.227
65 67	6 1 1 4	26 98 26 98	0.248 2.163 0.496	95.674
71 73	17 15	27 19 27 34	0.248	96.418
74 75	1 2	2735 2737	0.035 0.071	96.986 97.057
76 78	$2\frac{7}{a}$	2744 2766 2770	0.248 0.783	98.085
6666667777777888	171 611 147 111 272 240 230	11000000000000000000000000000000000000	9.214035836825180294 9.30202020000000000000000000000000000000	044721140806755760 1210217771585081750 1210217771585081750 121021771561499050000000000000000000000000000000000
-	-			

```
(1) ENTERIL AFTER SEP 78, OTHERWISE ())
LATERNIT FREQUENCY CUM FREQ PERCENT CUM PERCENT
              C
                                                 2543
2820
                                                                      90.177
                                                                                               90.177
                DMDC-BASEL HIGHEST PAY-GRADE ATTAINED FREQUENCY CUM FREQ PERCENT CUM PERCENT
FAYGFADE
                                                                      3.901
3.830
8.191
44.645
39.362
0.071
                                                                                               97.927
15.9590
100.00
100.00
                          110
108
231
1259
1110
                                                 110
218
449
1708
2820
                  NHRC FILE--HIGHEST PAYGRADE ATTAINED FREQUENCY CUM FREQ PERCENT CUM
  NUHYPAY
                                                                                      CUA PERCENT
                                                                                               0.6C3
11.773
11.454
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                          17
95
220
1401
1087
                                                                      0.603
3.369
7.801
49.681
38.546
              12345
                                                 112
1733
1733
2820
                      SUCCESS ON ICS CRITERION (1) FREQUENCY CUM FREQ PERCENT
  SUCCIAF
                                                                                      CUM PERCENT
                                                                      13.936
                      HIGH FAYGRADE SUCCESS CRITERION. FREQUENCY CUM FREQ PERCENT C
                                                                                      CUM PERCENT
SICCFAYG
                          474
2346
                                                                      16.809
83.191
                                                                                                16.809
                  REENLISIMENT ELIGIBILITY CRITERION. FREQUENCY CUM FREQ PERCENT CU
                                                                      10.390
                                                                                               10.390
              0
                    SUCCESS ON COMPOSITE CRITERION (1) FREQUENCY CUM FREQ PERCENT CU
STCCESS2
                                                                                       CUM PERCENT
                          655
2165
                                                 655
2820
                                                                      23.227
                                                                                               100.000
    MONTHS OF TOTL. ACTIVE FED. MILIT. SERV.
TAFMS 1 FREQUENCY CUM FREQ PERCENI CUM PEFCENT
                                                                        0.035
0.142
0.071
0.2135
0.106
0.284
0.319
0.177
0.177
                                                                                                   C-124693
C-124693
C-468637
C-468630
C-46830
            2789011
111
111
                                                      1573475494
11175494
```

171700007(\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\	900017700000000000000000000000000000000	387816110553057483707749628373425234012942636584402550180 111111111111111111111111111111111	9790.677597548718272685878337257480766931026192974701920311719077551758477447404547411749296423002797766860390731331113313221024111123212221162744299810972080822574753160	97760207218836527175028719758080526441733146684547637445466907876767676787444444546690787676767874444446466907878078078090479124679024669777778888888888888999999999999999999
--	---	--	--	---

TABLE XV
Selected Correlations

	TAFMS1	SUCCTAF	SUCCESS2
AFÇIGFFS	-0.08930	-0.06108	-0.05137
	0.0001	0.0012	0.0064
AFÇIFCNI	-0.07755	-0.05346	-0.04182
	0.0001	0.0045	0.0264
ENTRYIGE	0.05518 0.0034	0.02593 0.1686	0.05698
ENIFFAIG	0.03578	-0.00926	C.01083
	0.0575	0.6230	O.5653
TEFMENIT	0.14720	0.02116	0.05189
	0.0001	0.2614	0.0059
CEYEC	0.07522	0.07554	0.11471
	0.0001	0.0001	C.COC1
HSIG	0.09918	0.12117	0.15525
	0.0001	0.0001	C.0001
NUSEX	0.08426	0.04868	0.01204
	0.0001	0.0097	0.5229
WHITE	-0.10983	-0.06035	-0.04767
	0.0001	0.0013	0.0114
BIACK	0.10220	0.05290	0.02641
	0.0001	0.0050	0.1608
CIFER	0.03329	0.02342	0.04265
	0.0771	0.2139	0.0235
SCHEEN	-0.00478 0.8022	0.07461	0.C8891 C.OOC1
ALCOMICS	-0.05463	-0.02132	0.00440
	0.0037	0.2578	0.8153
ACPINSCR	-0.075 £1	-0.02971	-0.02934
	0.00 01	0.1147	0.1192
SASVAFAD	0.00263	0.01025	0.01356
	0.8888	0.5864	0.4717
SASVAFAI	-0.06941	-0.03415	-0.00654
	0.0002	0.0698	0.7285
SASVAFAR	-0.05163	-0.02568	-0.01734
	0.0061	0.1727	0.3574
SASVAFEI	-0.03140	-0.01303	0.01707
	0.0955	0.4893	0.3648
SASVAEGI	-0.01535 0.4152	-0.02107 0.2633	-0.00768
SASVAEMC	-0.06570	-0.04088	-0.02361
	0.0005	0.0300	(.2101
SASVAEMK	-0.03166	0.00698	0.02288
	0.0928	0.7112	C.2245

SASVAENC	-0.03869	-0.01504	-0.00541
	0.0399	0.4246	0.7741
SASVAESI	-0.03834	-0.00090	-0.0387
	0.041£	0.9618	C.8370
SASVAESE	-0.04680	-0.02609	-0.00735
	0.0129	0.1660	0.6964
SASVAEGS	-0.03464	-0.02632	-(.01036
	0.0659	0.1622	0.5822
SASVAEWK	-0.06134	-0.05225	-0.04783
	0.0011	0.0055	0.0111
INTERO1	0.05262	0.03656	0.04814
	0.0052	0.0523	0.0106
INTERC2	0.05869	0.02943	0.04022
	0.0018	0.1182	0.0327
INTERC3	0.07253	0.03665	0.04668
	0.0001	0.0516	0.0132
INTERC4	0.06297	0.03358	0.04590
	0.0008	0.0746	0.0148
INTERC5	0.06033	0.03101	0.04114
	0.0013	0.0996	0.0289
INTERC6	0.01791	0.02303	C.02259
	0.3417	0.2215	0.2222
INTERC7	0.09619	0.05711	0.03859
	0.0001	0.0024	0.0384
INTERC8	0.11832	0.12665	C.149C6
	0.0001	0.0001	0.0001
INTERC9	0.122 82	0.11899	C. 160C0
	0.00 01	0.0001	0.0001
INTEF 10	0-07658	0.10700	0.14937
	0-0001	0.0001	0.0001
INTER 11	0.00621 0.7416	0.04010 0.0332	0.06954
INTEB 12	0.10322	0.05193	0.02540
	0.0001	0.0058	0.1775
INTEB 13	0.109 85	0.05469	0.02934
	0.00 01	0.0037	0.1193
INTEF 14	0.10585	0.0553 <b>7</b>	0.03218
	0.0001	0.0033	0.0876
INTER 15	0.06099	0.03034	0.00764
	0.0012	0.1073	0.6852
INTER 16	0.14975	0.05095	0.03845
	0.0001	0.0068	0.0412
INTER 17	-0.00842	0.00025	0.001E0
	0.6550	0.9896	0.9240
INTER18	-0.05198	-0.01436	-0.02373
	0.0058	0.4460	0.2077

INTER19	0.00629	-0.02271	0.01637
	0.7384	0.2280	0.3849
INTER20	-0.05623	-0.02818	-0.02189
	0.0028	0.1347	0.2452
INTER21	-0.08291	-0.03788	-0.02863
	0.0001	0.0443	0.1286

Ncte: The first number is the correlation be: ween the predictor and the criterion, the second number is the significance level.

## APFENCIX C REGRESSION ANALYSIS PROGRAMS

Regression analysis attempts to predict or explain the values of the criterion variable with one or more predictor variables. The following sections expand upon the discussion of regression analysis presented in Chapter IV.

## A. FEQUIREMENTS AND ASSUMPTIONS

When conducting regression analysis, certain requirements must be met or assumed. One of these requirements is the use of quantitative variables. 5 Application of regression procedures also requires normality (the value of the dependent variable must be normally distributed at each value of the independent variable), homoscedasticity (the variation around the regression line must be constant for all values of the independent variable), and independence of error (the residual difference between an observed and predicted value of the dependent variable must be independent for each value of the predictor variable. requirement of linear regression is that a straight-line cr linear relationship exist between each independent variable and the dependent variable. For purposes of this study, and tased or initial investigation, these requirements are assumed to be met. Ecwever, an extensive effort to evaluate these assumptions by transforming the variables or employing complex statistical analysis packages conducted.

<sup>\*</sup>The inclusion of qualitative or categorical variables in regression models may be accommodated through the use of dummy variables.

#### E. STEPWISE REGRESSION

The SAS Stepwise process considers each of the candidate independent variables for inclusion in the model by determining the contribution the variable makes to the model. This determination is accomplished by calculating the partial F statistic for the variable, and adding it to the model if it meets the specified entry significance level. After a variable is added, the stepwise method then looks at all the variables in the model and deletes any variable that does not provide an F statistic sufficient to meet the specified significance level for remaining in the model. This process of adding and deleting variables continues until none of the variables has an F statistic significant to enter or leave the model. [Ref. 12]

#### C. LINEAR REGRESSION

Simple linear regression is concerned with finding the statistical model or equation that best "fits" the criginal data. This is accomplished by defining a straight line that minimizes the differences between the actual value of the dependent variable and the value that would be predicted from the fitted line of regression. The SAS Regression procedure uses a mathematical technique, the least-squares method, to produce such an equation for the best linear model. This equation provides the intercept and slope of the sample predictor variable. With multiple linear regression, these slopes represent the unit change in the dependent variable per unit change in the independent variable, taking into account the effects of the other independent variables, and are referred to as net regression coefficients. The sample regression coefficients of the predictor

<sup>6</sup>This study used the SAS Stepwise default significance level of .15 for variables to enter or remain in the model.

variables are then used as estimates of the respective population parameters. For illustration, the program used to validate Model A is provided in Taple XVI.

# TABLE XVI Sample Validation Program

//ALVALIE JCB (2807,C110), D CSLUND, SMC 1763, CL ASS=E
//\*MAIN CRG=NPGVM1.2807P
FIEC SAS
//FILEIN ID DISF=SHE,DSN=MSS.S2807.ADALL4
//SYSIN ED \*
CPTICNS IS=80 NOCENTEF;

\* THIS FFOGRAM CALCULATES THE VALIDITY CF A REGRESSICN MCIEL THROUGH THE USE OF CROSS-VALIDATION AND DCUELE CROSS-VALIDATION TICHNIQUES.;

IATA IATA1:
SET FILEIN.ADALL4;

\* THE BANDOM VARIABLE CREATED IN 'ADNEWVAR' IS NOW USED TO SPILT THE DATA AFFROXIMATELY IN HALF. DERIVA' IS THE DEBIVATION SAMFLE AND 'VALIDA' IS THE HOLD-OUT OR VALIDATION SAMFLE.;

CATA IFFIVA;

SET CATA1;

IF FANCALL1 = 1;

CATA VALIDA;

SET CATA1;

IF FANCALL1 = 0:

\* A ELCCK EEGRESSION IN NOW RUN ON DERIVA TO COMPUTE AND OUTFUL THE PARAMETER ESTIMATES (BETAS) THAT RESULT FROM THE REGRESSION. THE BETAS ARE WRITTEN TO THE DATASET WORK-EETAD. THE MODEL IS GIVEN THE LABEL TARMHAIV.;

FROC FEG CATA=DEBIVA CUTEST=BETAC;
TAFMHATV: MODEL TAFMS1 = ADMINSCR TERMENLT DEPENDTS FIACK
HSDG OTHER NUSEX / SIE;
TITLE FEGRESSING ON DERIVA:

\* THE NEXT STEP IS TO APPLY THE REGRESSION FORMULA (THE BETAS) TO THE DATA IN THE VALIDATION SAMPLE AND CALCULATE THE FRELICTED SCORE FOR EACH CASE IN VALIDA. THE FRELICTED SCORE WEITEN TO WORK PREDITARY. SAS USES THE MODEL LAFEL (TAPMHAIV) AS THE VARIABLE NAME FOR THE VALIDA PRELICTED SCORES. THE SCORE PROCEDURE PRODUCES NO PRINTED OUTPUT.;

FROC SCCFE CUT=PREDTARY TYPE=OIS SCORE=BETAD LATA=VALIDA PREDICT;
VAF ALMINSCR TERMENIT DEFENDTS BLACK HSDG CTHER NUSEX;

\* THE FIRST VALICITY CCEFFICIENT IS NOW CALCULATED BY FINI-ING THE CCRRELATION BETWEEN VALIDA'S ACTUAL SCORES AND VALUE STREDICTED SCORES.;

FROC CCFF [ATA=PFECTAFY: VAR TAFMS 1 TAFMEATY: TITLE FIRST VALICITY CCEFFICIENT.: NCW TO REFEAT THE FROCESS TO UTILIZE THE DOUBLE CFCSS-VALUATION TECHNIQUE. THIS TIME A REGRESSION IS RUN ON VALUA AND THE RESULTING FETAS (BETAV) ARE USED TO PRELICT THE SCORES OF THE CASES IN DERIVA. DERIVA'S ACTUAL AND PRELICTED SCORES ARE THEN CORRELATED TO FINE THE SECOND VALIDITY COEFFICIENT.;

FROC BEG CATA=VALIDA CUTEST=EETAV:
TAFMHATC:MODEL TAFKS1 = ADMINSCR TERMENLT DEPENDIS ELACK
ESCG OTHER NUSEX / SIE;

TITLE REGRESSING ON VALIDA;

PROC SCORE CUT=PREDIAIR TYPE=CIS SCORE=BETAV RAIA=DERIVA PRILICT;
VAF ALMINSCR TERMINIT DEFINITS BLACK HSDG OTHER NUSEX;

FROC CCEF LATA = PEECTAFC:
VAR TAFMS 1 TAFMEATD:
TITLE SECOND VALIDITY COFFICIENT;

/\* //

# <u>APFENDIX</u> <u>D</u> DISCRIMINANT ANALYSIS PROGRAMS

Discriminant Analysis allows observations to be classified into two or more groups on the basis of one or more numeric variables. The following sections expand upon the discussion of discriminant analysis presented in Charter IV. For illustration, Table XVII shows the program used to produce the classification matrices for the derivation and validation samples for Model A.

## A. FEQUIREMENTS AND ASSUMPTIONS

As was the case with regression analysis, discriminant analysis also requires that certain basic assumptions be met. First, the chservations in the data set should be members of two or more mutually exclusive groups. Therefore, the groups must be defined so that each case will helong to only one group. Another statistical property required of discriminating variables is that they may not be linear combinations of other variables. Thus, the sum or average of several variables may not be used along with those variables. There are three other assumptions to be considered. The population covariance matrices must equal for each group, each group is to be drawn from a population which has a sultivariate normal distribution, discriminating variables must be measured at the interval or ratic levels. Ideally, these variables will be continuous, tut they need not be. [Ref. 17] This study assumes these requirements have beer met. However, an effort to evaluate these properties was not conducted since, in practice, discriminant analysis technique is rather robust and can tolerate some deviation from these assumptions [Ref. 18].

#### E. CISCRIMINANT ANALYSIS

The first step of discriminant analysis is to weight and linearly combine the discriminating variables so that the groups will be as statistically distinct as possible. The derived equations, called discriminant functions, combine the group characteristics using a measure of generalized squared distance? that will allow one to identify the group to which a case belongs or most closely resembles.

The classification process may assume that membership in a group has equal likelihood of occurring. However, it may be more desirable to incorporate the prior probability of group membership into the classification function to improve prediction accuracy or minimize the cost of prediction errors. In this study, membership in a success group was on the order of 80 percent. Therefore, it was appropriate to consider prior probabilities so that those cases predicted as unsuccessful would be classified as such only if strong evidence exists that they belong there.

The ultimate concern in developing a mathematical model is that it predict well or provide a reasonable description of the real world. Once a model is developed which provides satisfactory discrimination for cases of group membership, classification functions may be derived and applied to the classification of new cases with unknown group membership. A good test of the adequacy and accuracy of the discriminant model is the percentage of correct classifications, commonly called the "hit-rate". This test is accomplished by applying the classification function to the known cases from which the function was derived. The percentage of correctly

<sup>7</sup>The procedure conducted a likelihood ratio test of homogeneity of the within-group covariance matrices for each model. This test was statistically significant for each model. Therefore, the within-group matrices were used as the tasis of the measure of generalized squared distance in developing the classification criterion. [Ref. 12]

classified cases provides an indication of the accuracy of the procedure and indirectly confirms the degree of group separation. The results may be depicted in a classification matrix.

When the sample size is large enough, as it is in this study, a further check of the classification accuracy may be conducted by randomly splitting the sample into two subsets. The classification function is derived on one subset and validated on the other subset. A comparison of the two hit-rates provides the measure of accuracy of the model. [Ref. 17]

#### TAPLE XVII

## Sample Discriminart Analysis Program

C

```
//DISCEGES JOB (2807,C110), 'D CSLUND, SMC 1763',CLASS=B
//*MAIN CEG=NPGVM1.28C7P
// EXEC SAS
//FILEIN LD DISF=SHE,DSN=MSS.S2807.ADALL4
//SYSIN LD *
CPTICNS IS=80 NOCENTEF:
* THIS PURPOSE OF THIS PROGRAM IS TO ALLOW THE VALIDITY OF A DISCRIMINANT MCDEL TO BE INVESTIGATED. A CLASS-IFICATION FUNCTION IS DERIVED FROM THE DERIVA SAMPLE AND THIS FUNCTION IS USED TO CLASSIFY THE CASES IN THE VALIDATION (OR HOLL-OUT) SAMPLE. THE TWO CLASSIFICATION MAISICIES ARE THEN USED TO ALLOW THE "HIT RATE" ON EACH SAMPLE TO BE CALCULATED.;
LATA [ATA1:
SET FILEIN. ADALL4;
 * USING THE RANDOM VAFIABLE TO SPLIT THE SAMPLE APPROXIMATELY IN EALF.;
CATA CERIVA;

SET CATA ;

IF FANCALIA:

CATA VILICA;

SET CATA;

IF FANCALIA:
 * CALCULATING THE CLASSIFICATION MATRIX FOR DERIVA AND WRITING OUT THE CLASSIFICATION FUNCTION DERIVED FROM DEBIVA TO WORK.D.;
FROC LISCRIM DATA=DEFIVA OUT=L FCCL=TEST;
CIASS SUCCTAF;
VAF DEFENDTS ASDG BLACK TERMENL
NISEX CTHEF ADMINSCR;
PRICES FFOPCRIIONAL;
TITLE DISCRIM ON DERIVA.;
                                                                                                TERMENLT
* NCW TEE CLASSIFICATION FUNCTION FROM DERIVA IS USED TO CLASSIFY THE CASES IN VALIDA.:
FROC DISCRIM DATA=D TESTDATA=VALIDA;
TESTCIASS SUCCTAF;
TITLE DEFIVA**S FUNCTION APPLIED TO VALIDA.;
1*
```

# <u>APFENCIX</u> E UTILITY ANALYSIS PROGRAMS

This appendix provides further details of the information contained in Chapter V, and gives examples of the SAS programs and outputs.

#### A. CAICCIATION OF CHIL PROFABILITIES

The method used to calculate cell probabilities in this study depends on whether a regression or a discriminant model is being evaluated. A regression model can be viewed simply as a formula for calculating predicted scores, whereas a discriminant model actually classifies cases as predicted successes or predicted failures. Escause of this difference, the calculation of cell probabilities is more complicated for regression models than for discriminant models.

## 1. Fegressich Mcdels

A regression model and the data from which it was developed provide information on the predicted and actual scores for each case. In order to classify these cases into the four selection outcomes, the out score on the predictor and the score on the criterion above which people are considered to be successful must be known. If the criterion is constructed as a dichotomous (success/fail) variable, then the cases assigned a value of "one" are considered successful and those with a value of "zero" are considered unsuccessful. If the criterion is a continuous variable (such as length of service) then a value on the scale must be chosen as the dividing line between success and failure.

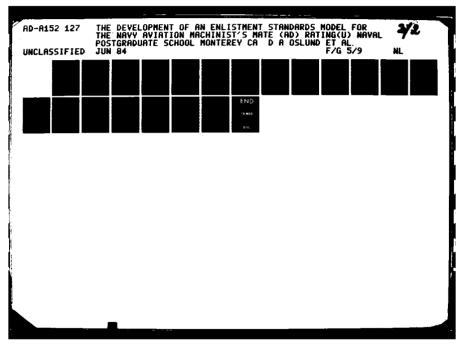
The choice of the cut score is not such a simple matter, and cannot be arbitrarily assigned as can the distinction between success and fail. The choice of the cut score, as mentioned before, often depends on the desired selection ratio. In the absence of information on the desired selection ratio, cell probabilities are calculated for each of many possible cut scores, and a cut score is eventually chosen based on which set of cell probabilities maximizes the utility of the model. In a data set containing actual and predicted scores, different sets of cell probabilities can be calculated if each predicted score is considered to be a cut score. Table XVIII contains five pairs of actual and predicted scores which will be used to illustrate the method.

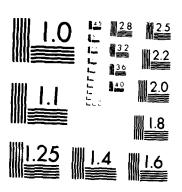
TABLE XVIII

Illustrative Actual and Predicted Scores

Actual Criterion	Predicted Criterion
Score	Score
54444	44 46 47 49 50

In this illustration, cases who serve 48 months or longer are considered to be successful. Each different predicted score will be considered as a cut score and cell counts for each cut score will be calculated. If the cut score is 44 months, then all cases with a predicted score of 44 months or more will be accepted, and those with a predicted score of less than 44 months will be rejected. In this example, for a cut score of 44, all cases will be accepted. No one is rejected, therefore, valid negatives and false negatives will be zero. Of the five cases





MICROCOPY RESOLUTION TEST CHART

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accepted, three have actual LCS of 48 months or more (successes). Therefore, the number of valid positives is three. Two of the five cases accepted had actual ICS of less than 48 months (failures). Therefore, false positives will be two. Thus the first set of cell probabilities that result when the cut score is 44 are: PVP = 3/5, PFF = 2/5, FFN = 0 and PVN = 0. The next set of cell protatilities will result when 46 months is considered to be the One case had a predicted LOS of less than Therefore, he would be rejected. His actual LOS is 50 months, so he was falsely rejected, i.e. FN = 1. else was rejected so VN = 0. Four cases had a predicted ICS cī 46 cr greater so all four would be accepted. Cf th∈se four, two had actual LOS of less than 48 months (FF), and two had actual LCS of 48 months or more (VP). Thus for a cut sccre of 46, PVP = 2/5, PFP = 2/5, PFN = 1/5 and FVN = This process is repeated until five sets of cell probabilities (one for each different predicted sccre) calculated.

### 2. <u>Fiscriminant Models</u>

In a discriminant model the criterion is a categorical (0,1) variable. The output from the SAS Discriminant procedure is a two by two table where the cases are predicted to be either a "zero" or a "one", and the prediction is compared to the actual score. Table XIX gives an altreviated example of the output from the discriminant procedure.

The columns are the model's predicted scores for the 750 cases in this hypothetical sample. Here the model predicts that 300 of the cases will score "zero" on the criterion, and it predicts that 450 of the cases will score a "one" on the criterion. The rows are the actual scores of the cases. 250 people actually scored "zero" (failures) and

TABLE XIX
Illustrative Discriminant Example

1	Predicted	
۵	1	l

		0	1	Tot al
Actual	0	100	150	250
	1	200	300	500
	Total	300	450	750

500 people actually scored "one" (successes). Because, in effect, the discriminant procedure chooses its own out score, the four cell probabilities can be derived directly from the output. The predicted "ones" are people that the model classifies as accept. Of these 450, 150 actually failed so they are false positives, and the remaining 300 were successful, so they are valid positives. Of the 300 cases that the model would have rejected (predicted "zeros"), 100 were failures (valid negatives) and 200 were successes (false negatives). Again the cell probabilities are found by dividing each count by the number of cases. Therefore, FVP = 300,750, PFP = 150,750, PFN = 200,750 and FVN = 100,750. For a discriminant model, there is only one set of cell probabilities to be calculated.

### E. ESTIMATION OF CELL UTILITIES

In order to calculate the overall utility of a model, utilities associated with each selection outcome need to be estimated. "Although the assignment of utility values to outcomes may very well be the 'Achilles Heel' of decision theory, it is not a problem that can be ignored by any institution that makes personnel decisions." [Ref. 19]

Ideally each selection outcome should have a uniquely estimated utility. Fecause of the difficulty in estimating

utilities for each cutcome (particularly for the false and valid negatives), relative utilities are estimated. It is apparent that a person who is correctly selected (valid positive) has a positive worth to the organization. A reasonable estimate of this worth is the marginal product of the employee. In this study it is assumed that the navy compensates sailors at the full value of their marginal product, and the Billet Cost Model provides an estimate of the cost to the Navy of staffing a billet [Ref. 16]. Fecause relative utilities are the issue at this time, the utility of a valid positive (U1) is assigned the value of +1.

It is a reasonable assumption that the utility cf a false positive is a regative number. As the employee was not judced to be successful, his marginal product was probably less than the marginal cost to keep him in the jch. In addition a poor performer may adversely affect the performance and productivity of his fellow employees, and when he additional expense is necessary to find a replace-On the other hand, it is unlikely that a performer does not contribute anything to the organization, and thus it is obviously difficult to estimate the magnitude cf the disutility of a false positive. In this study a minor form of sensitivity analysis is undertaken to circumvent this estimation difficulty, and expected overall utilities are calculated for three different relative values of false positive utility (U2). These values are -.5, -1, and a relatively extreme assumption, -2.

The disutility of a false negative is also difficult to estimate, partly because it is not known what happens to the applicant after he is rejected. If the Navy rejects an applicant to the AD rating but accepts him in another rating where he is subsequently successful, then his disutility could be reasonably argued to be zero. If, however, the

Navy rejects him altogether when he would have been successful if selected, then the costs of attracting and testing him are wasted and additional costs are required to attract and test another applicant. These costs will depend on the state of the recruiting market at the time. If there are many good quality applicants then the disutility of rejecting a potentially successful applicant may be small. Again, as a type of sensitivity analysis, three relative values for the utility of a false negative (U3) are considered: 0, -.25 and -.5.

It is not obvious that any utility should be assigned to U4, the utility of a valid negative. The person would have failed anyway, so nothing was gained by rejecting him. However, when viewed from an economist's viewpoint in relation to opportunity costs, the fact that the person was correctly rejected means that the organization did not have to hear the cost of incorrectly accepting someone who turns out to be unsuccessful. Thus, correctly rejecting an applicant is of equal and opposite utility to incorrectly accepting him. Therefore, U4 = -U2.

The use of relative utilities is a convention to simplify the estimation of cell utilities. In the above discussion relative utilities are estimated on the tasis that the utility of a valid positive is +1. values of 11 through 04 that are used in the formula for cverall expected utility, (Equation 5.1), need to be expressed in actual dollars. As mentioned above, the Eillet Cost Model is used to estimate the utility of a valid posi-The standard manyear cost of an E-4 Aviation Machirist's Mate is \$24,163. This cost comes from financial year 1983 data and regresents the total cost to the Navy of creating and filling a job slot over one full year. [Ref. 16] A utility of +1 is therefore equivalent to +\$24,163, a utility cf -.5 will be -\$12,082, and so cn.

#### C. FREGFAMS USED TO CALCULATE UTILITIES

As mertioned in Section A. above, the calculation of cell probabilities for a regression model is a fairly tedicus and repetitive procedure. This section contains three sample programs used to calculate the expected utility Explaratory comments are provided following each set of SAS statements. The first program (Tabl∈ XX) computes the predicted criterion score for each case writes the results cut to a file called "RTYHATA". XXI shows part of the output from the first program. second program's main purpose (Table XXII) is to calculate the cell probabilities that would result if each different predicted score were used as a cut score. The cell probabilities are writter out to a file called "RTUTIIA". grogram also calculates the expected utilities for one set cf cell utilities and outputs the 30 largest utilities that result (Table XXIII). The third program (Table XXIV) calculates the utilities for six different sets utilities.

As explained before, only one set of probabilities results from a discriminant model and these can be readily gained from the discriminant output. No programs were used to calculate the expected utilities of a discriminant model and these calculations were done by hand.

### C. CAICCIATION OF BASE LINE UTILITIES

As described in Chapter V, the utility of the Navy's criginal selection strategy (the base line utility) needs to be calculated in order for comparisons to be made. Chapter 4 in Table XXIII demonstrates that when all the cases are accepted (41.0774 is the lowest predicted score), the selection ratio is obviously 1 and PVP = .860638 (which is the lase rate) and PFP = 1 - PVP = .139362. No one is

rejected, therefore PFN and FVN are zero. The expected utility under these circumstances is:

EU = .860638(\$24,163) + .139362(-\$12,082) + C + 0 = \$19,112

As Table XXIII shows, the maximum utility occurs when the cut score is slightly higher than the lowest predicted score (there are five cases with a predicted score of less than 43.2692 in Table XXI). This maximum utility (\$19,135) is .12 percent greater than the base line utility of \$19,112.

#### TABLE XX

### First Ctility Analysis Program

```
//SEIUTII1 JOB (2840,C104), 'SEI CLARK, SMC 1560', CLASS=E
//*MAIN CRG=NPGVM1.2840P
EXEC SAS
//PIIFIN II DISP=SHE,DSN=MSS.S2807.ADAIL4
//FIIFCUI DI UNII=3350V, MSVGP=FUE4A,DISP=(NEW,CAILG, LELETE),
DSK=MSS.S2840.REVHATA,
                            CCB = (ELKSIZE=6400)
//SYSIN ID *
CPTICES IS=80 NOCENTES;
        THE FURFCSE OF THIS FROGRAM IS TO CALCULATE THE PREFICTED SCCRE FOR EACH CASE (USING THE MODEL DEVELOPED FRE-ICUSIY), AND TO WRITE OUT THE ACTUAL AND PREDICTED SCCRES TO A FILE IN MASS STORAGE.;
IATA IATA1;
SET FILEIN. ADALL4;
RENAME TAFMS1=Y;
          RENAMING THE CHITERION VARIABLE:
FROC FEG LATA = DATA 1 CUTEST = EETAS;
YHAT: MCDEL Y =
DEFENDIS ESDG ELACK OTHER NUSEX TERMENLT ADMINSOR / SIE;
IITLE ELCCK REGRESSION TO OUTPUT BETAS.;
FROC SCCFE CUT = PREDY TYPE=OLS SCORE = BETAS DATA = DATA 1 FRED ICT; VAR CEFENITS HSDG FLACK OTEER NUSEX TERMENLT ADMINSCR;
          CAICULATES THE PEFFICTED SCORES, AND WRITES THEM TO DATASET PREDY.

NOTE: THE SCORE PROCEDURE TAKES THE MODEL LABEL (YEAT)
AND USES TEAT LABEL AS THE VARIABLE NAME FOR THE FREDICTED SCORE.;
TATA FRELY2;
SET FRELY;
KEFF YHAT Y SUCCTAF;
FROC SCRT LATA=PREDY2 CUT=FILECUT.RTYHATA;
BY YHAT;
           SCRIS TEE OUTPUT FILE INTO ASCENDING YHAT ORDER, AND WRITES OUT TEE SORTED DATA TO MASS STORAGE.:
     TA TEST:
SET FILECUT. RITHATA;
SET FILECUT. RITHATA;
IF _N_ LE 10 OR ( N GT 1270 AND _N_ LE 1280)
OR _N_ GT 2790;
 LATA
FROC FRINT LATA = TEST SPLIT = *:
LAEFI Y=ACTIAL*CFITERICN*SCCRE
YHAT=PRELICTIL*CRITERICN*SCORE
SUCCTAF=SUCCESS CN*CRITERICN;
TITLE THE FIRST 10, MIDDLE 10 AND LAST 30 OBS OF RIYHATA;
TITLE 2:
NCTE: SORTED IN ASCENDING ORDER OF YHAT.;
 FROC UNIVARIATE CATA=FILEOUT.RTYHATA PLOT;
VAR YHAT Y SUCCTAF;
TITLE STATS OF THE ACTUAL AND FREDICTED CRITERION SCCRES;
```

TABLE XXI
Fartial Output from the First Utility Program

THE FIRST 10, MIDLE 10 AND LAST 30 OBS OF RIVHAIA NOTE: SORIED IN ASCENDING ORDER OF YHAT.

CES	ACTUAL CRITEFION SCORE	SUCCESS ON CRITERION	PREDICTED CRITERION SCORE
OKOR JOINT IN TOKOM JOINT IN TOKOM JOINT IN TOKOM JOINT IN TOKOM JOINT IN TOKOM JOINT IN TOKOM JOINT IN TOKOM JOINT IN TOKOM JOINT IN TOKOM JOINT IN TOKOM JOINT IN TOKOM JOINT IN TOKOM JOINT IN THE TOKOM JOINT JOINT IN THE TOKOM JOINT IN THE TOKOM JOINT IN THE TOKOM JOINT	426112154455446743444555575645565235566655666766564	001000011111111111111111111111111111111	447702222211111111119999999992222222222222

#### TABLE XXII

#### Second Utility Analysis Program

```
//SEILTIL2 JOB (2840,C104), 'SEI CLARK, SMC 1560',CLASS=E
//*MAIN CEG=NPGVM1.2840P
// EXEC SAS
//SAS.WCFK LD SPACE=(CYL,(12,4))
//FILEIN LD DISP=SHE,DSN=MSS.S2840.RTYHATA
//FILEUT LD UNIT=3330V,MSVGF=FUB4A,DISP=(NEW,CATLG,LELFIE),
DSE=MSS.S284C.RTUTILA,
LCB=/FLKSIZF=6400)
CPTICES IS=80 NOCENTIF;
      THE FUEFCSE OF THIS PROGRAM IS TO WRITE OUT A FILE TO MASSICEAGE WEICH CONTAINS THE VALUES OF PVP, PFP, PFN AND EVERTHAL RESULT WHEN EACH PRELICTED SCORE IS USED TO SEPARATE THE CASES INTO ACCEPT AND REJECT GROUPS (IE. OUTPUT THE CELL FFCEABILITIES THAT RESULT WHEN EACH PREDICTED SCORE IS USED AS A CUTTING SCORE).
                                                                                                                                                                                              TO MASS
      THE INFUT FILE CONTAINS 3 VARIABLES, AND THE OBSERVATIONS (OB CASES) ARE SORTED IN ASCENDING ORDER OF 'YHAT'. YHAT IS THE PREDICTED ICS (FROM THE MODEL DEVELOPED EARLIEF) OF EACH CASE, 'Y' IS THE ACTUAL ICS IN MONTHS AND 'SUCCTAF' IS A DUMMY VARIABLE WHERE EACH CASE IS CATEGORIZED AS A SUCCESS (1) OR AS A FAILURE (0).;
IATA IATA1;
SET FILEIN. RIYHATA;
DECE Y;
RENAME SUCCTAF = Y;
      THE CATA IS READ IN AND THE ACTUAL LOS IN MONTHS VARIABLE IS ERCEPEL AND THE CUMMY VARIABLE IS RENAMED 'Y'.;
FROC SUMMARY DATA=DATA1:
            VAF
          VAR Y:
CUTFUT CUT=DATA2 SUM=NSUCC N=NCASE;
     HERE THE NUMBER OF SUCCESSFUL CASES IN THE DATA (NEUCC) IS FOUND BY SUMMING THE 1°S AND 0°S IN VARIABLE °Y°. ANOTHER VARIABLE "NCASE" IS CREATED WHICH IS THE NUMBER OF CASES IN THE DATA. THESE TWO VARIABLES (EACH A SINGLE NUMBER) ARE WRITTEN TO DATA SET WORK-DATA2.;
IATA IATA3;

IF N FC 1 THEN SET DATA2;

NFATI = ACASE-NSUCC;
           SET TATA 1;
      THE VAFIAELES NCASE, NSUCC AND NFAIL (THE NUMBER OF UNSUCCESSFUL CASES IN TELEDATA) ARE ADDED TO DATA1. NCASE, NSUCC AND NFAIL ARE EACH SINGLE NUMBERS THAT ARE REPEATED FOR FACH CBSERVATION. EG. NCASE IS A COLUMN OF 500°S (SAY), NSUCC IS A COLUMN OF 325°S (SAY) AND THEREFORE NFAIL IS A COLUMN OF 175°S.;
```

```
CA LATA4:
SET LATA3:
U1= 24163: U2= -12082; U3= -6041; U4= 12082;
KETAIN NZERO 0:
RETAIN LASTYHAT 0:
IF YEAT NE LASTYHAT THEN LINK CALCS; ELSE LINK ZEROS;
IF Y=C TEEN NZERC=NZERO+1;
LASTYHAT;
RETUEN:
LATA
                RETUEN:
                                                    VF = NSUCC-(N-1-NZERO);
FF = NFAIL-NZERO;
FN = N-1-NZERO;
VN = NZERC;
UILL = (U1*VP + U2*FF + U3*FN + U4*VN)/NCASE;
SHATIC = (VE+FP)/NCASE;
SUCCRATE = VE/(VP+FE);
                CAICS:
                                                      BETURN;
                ZEFCS: VF = 0;
UILL = 0;
                                                                                                                 FF = 0;
SRATIO = 0;
                                                                                                                                                                                     FN = 0;
SUCCRATE = 0:
                                                                                                                                                                                                                                                                            VN = C:
                                                      FETURN:
        THIS IS THE HEART OF THE FROGRAM WHERE SUBTIE LOGIC IS EMELOYED. 'NZERO' IS A COUNTER WHICH COUNTS THE NUMBER OF O'S IN THE 'Y' VARIABLE DOWN TO AND INCLUDING THE LINE (OR OBSERVATION) CONTAINING THE "CURRENT" CUTTING SCORE. FOR EXAMPLE, IF THERE ARE 150 ZEROS AND 250 ONES AMONG THE FIRST 400 OBS. OF 'Y', THEN THE 400TH OBS. OF 'NZERO' WILL BE 150. IF THE 401SI OBS. OF 'Y' IS A ZERO THEN TEE 401SI OBS OF 'NZERO' WILL BE 150. IF THE 401SI OBS. OF 'Y' IS A ZERO THEN TEE 401SI OBS OF 'NZERO' WILL BE 151. TO CONTINUE THE EXAMPLE, BECAUSH THE INPUT LATA IS SCRIED IN ACCENDING CROSE OF 'YEAT', THE 400 CASES PRECEDING THE 401ST CASE (WHICH IS THE CUFRENT CUTTING SCORE), WOULD ALL BE CLASSIFIED AS REJECT BECAUSE THE 400TH OBS. OF 'NZERO' TELLS US HOW MANY OF THESE REJECTED CASES WERE FAILURES AND THEREFOLE WANY OF THESE REJECTED CASES WERE FAILURES AND THEREFOLE WANY OF THESE REJECTED AND THE ADDRESS THAT FAILED, TEEREFORE WHALL-VN (SAME AS NFAIL-NZERO) = FP. THE NUMBER OF CNES IN THE TOTAL NUMBER OF CASES THAT FAILED, TEEREFORE WHALL-VN (SAME AS NFAIL-NZERO) = FP. THE NUMBER OF CNES IN THE REJECTED 400 CASES (FN) IS THE OUR FAILED. THE NUMBER OF SUCCESSES, THEREFORE NSUCC-FN IS THE VALUE OF VP.
         LASTYFAT IS USED TO PRECLUCE ANY ERRORS THAT WOULD FE GENERATEL WHEN TWO CR MORE VALUES OF 'YHAT' ARE IDENTICAL. IF THE NEXT POTENTIAL CUTTING SCORE IS THE SAME AS THE PREVIOUS CNE, THEN AC CELL FROEABILITIES, ETC ARE CALCULATEL, AND ZEROS ARE ASSIGNED.

NOTE: DUE TO THE USE OF THE KEYWORD 'RETAIN', THE VALUES OF NZERO AND LASTYHAT USED IN THE CALCULATIONS AND IN THE FIRST 'IF' STATEMENT ARE THE VALUES FROM THE PREVIOUS OBSERVATION.
          THE DATA STEP ALSO INITIALIZES A SET OF INDIVIDUAL CELL UTILITIES (U1 - U4) AND CALCULATES THE OVERALL UTILITY ASSOCIATED WITE EACH CUTTING SCORE. ALSO THE SELECTION RATIO AND THE SUCCESS RATE RESULTING FROM EACH CUITING SCORE FRE CALCULATIOS;
LATA LATAS:

SET CATA4:

PVF = VP/NCASE: FFP

PFN = FN/NCASE: FVN

KEIP YHAT UTIL PVL PF

RENAME YHAT = CSCCFE;
                                                                                                                FFF = FP/NCASE:
FVN = VN/NCASE:
FFF PFN FVN SRATIO SUCCRATE:
 IABEI
CSCCRE-CUI SCORE ON FFFCICTOR:
 * CCNVERTING THE CELL COUNTS TO PROBABILITIES .:
```

```
FROC SCET I ATA = DATA 5 CUT=FILECUT. LTUTILA;
EY FESCENDING UTII;
* SCFIING BY UTIL BEFORE WRITING OUT THE PREVIOUSLY KERT VARIELES TO A FILE IN MASS STORAGE.;
      A IAIA6;
SEI FILECUT. EIUTILA;
IF _N_ IE 30;
LATA
FROC FEINT LATA=CATA6;
TITLE TEE 30 LARGEST CTILLITIES IN THE FILECUT.;
TITLE3;
TITLE3; THE EASE UTILLITY IS 19112, AND THE;
TITLE4; TASE LINE SUCCESS RATE IS 0.8606;
FROC FICT CATA = CATA6;
PICT UTIL * CSCORE = *+* / VREF = 19112;
TITLE TEE TCP 30 UTILITIES FLCTTED AGAINST CUITING SCORE.;
TITLE : NCTE: THE HCRIZ. LINE IS THE BASE LINE UTILITY,;
TITLE4:
TITLE5 IF. THE UTILITY RESULTING FROM THE NAVY 'S:
TITLE 7: CFIGINAL SELECTION STRATEGY. (19112);
FROC FICT LATA=CATA6;
PICT UTIL * SEATIC = *+* / VREF = 19112;
TITLE THE TOP 30 UTILITIES FLOTTED AGAINST SELECTION RATIC.;
TITLE :
TITLE :
TOTAL THE HORIZ. LINE IS THE BASE LINE UTILITY,;
TITLE 4:
TITLE 5 IE. THE UTILITY RESULTING FROM THE NAVY'S:
TITLE 6;
TITLE 7 CRIGINAL SELECTION STRATEGY. (19112);
FROC FICT LATA=FILECTT.RTUTILA;
FICT UTIL * SEATIC = '+' / VREF = 19112;
TITLE FLOTTING ALL UTILITIES AGAINST SELECTION RATIC.;
TITLE2;
TITLE3; NCTE: THE HORIZ. LINE IS THE BASE LINE UTILITY,;
TITLE4;
TITLE5; IF. THE UTILITY RESULTING FROM THE NAVY'S;
TITLE6;
TITLE7; CRIGINAL SELECTION STRATEGY (19112);
TITLE7 CFIGINAL SELECTION STRATEGY. (19112):
/*
```

## TABLE XXIII Fartial Output from the Second Utility Prægram

THE BASE UTILITIES IN THE FILEOUT.

THE BASE UTILITY IS 19112, AND THE

EASE LINE SUCCESS RATE IS 0.8606.

CES	CSCCRE	UTIL	SEATIO	SUCCEAT	E PVP	PFP	FFN	PVN
123456789012345678901234567890 11111111111222222222222	10000000000000000000000000000000000000	557\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\\	898088220986517595398733650000 999C88888877555500998651119440000 999C88888877555500998651119440000	2121443333337777343696689402000 6666666666677778889999999110000 888888888888888888889999000 00000000	010133888 00410732535215244330000 8888888888888777777733333111130000 000000000000000000	898985 44444555554519772288330300 33333333333333333330099994333221110000 000000000000000000000000000	111078WIFEIFE0148WIFEWWWWWWT8COCC 00CCC0111111111445013M668WWC9CC 00CCCCCCCCCCT1111111115MM5666770000 00CCCCCCCCCCCCCCCCCCCCCCCCCCCC	11105555555445560001111111110700000000000000000000000

### TABLE XXIV Third Utility Analysis Program

```
//SEIUTII3 JOB (2840,C104), SEI CLARK, SMC 1560, CLASS=E
//*MAIN CRG=NPGVM1.2840P
// ENEC SAS
//FILEIN DD DISP=SHR,DSN=MSS.S2840.RTUTILA
//SYSIN DD *
CPTICNS IS=80 NOCENTEE;
          THIS ERGGRAM EXPLOSES THE EFFECTS OF USING DIFFERENT CELL UTILITIES FOR THE CALCULATION OF OVERALL UTILITY.:
IATA IATA1:
SET FILEIN. RTUTILA;
                                         U2A= -.5
U2E= -1
U2C= -2
U2E= -.5
U2E= -1
                                                                                                          U4A=
U4B=
          U 1 A = 1
U 1 E = 1
                                                                          U3 A = U3 E=
                                                                                            0
                                                                          Ŭ3C=
          U1C = 1
                                                                                            0
                                                                                                           U4C=
                                                                                                                            1<sup>5</sup>
                                                                     •
                                                                          U3E= -.5
U3E= -.5
          U 1 E =
                                                                                                           U4D=
          U1F= 1
                                                                                                           11 4 E=
                                                                                    + PFN*U3A + PVN*U4A) * 24163;
+ PFN*U3B + PVN*U4B) * 24163;
+ PFN*U3C + PVN*U4C) * 24163;
+ PFN*U3D + PVN*U4D) * 24163;
+ PFN*U3E + PVN*U4E) * 24163;
+ PFN*U3F + PVN*U4F) * 24163;
                              (FVP*U1A + FFF*U2A

(FVP*U1B + FFP*U2E

(FVP*U1C + FFP*U2C

(FVP*U1D + FFP*U2C

(FVP*U1E + FFP*U2E

(FVP*U1F + FFP*U2F
         UTILA=
UTILE=
UTILC=
         UTILE=
UTILE=
UTILE=
FROC SCRI LATA = DATA 1 CUI = SECOND;

EY LESCENDING UTILE;

LATA SECOND;

SET SECOND;

KEFF CSCCRE PVP PFF PFN FVN SRATIO SUCCRA! UTILE;

IF N IF 30;

FROC FFINT;

IITLE EASE UTILITY IS 17428 AND BASE SUCCESS RATE IS .8606;

TITLE;

TITLE;

TITLE;

TITLE;

TITLE;

TITLE;

TITLE;

TITLE;

FICT UTILE * SRATIC = '+' / VREF = 17428;
```

```
FROC SCRT INTA = DATA1 CUT=THIRD;
EY LESCENDING UTIIC;
IATA THIEL;
SET TEIRL;
KEFP CSCCRE PVP PFF PFN FVN SRATIO SUCCRATE UTILC;
IF N IF 30;
FROC FFINT;
TITLE FASE UTILITY IS 14061 AND BASE SUCCESS RATE IS .8606;
04 = 2
FROC SORT I ATA=DATA1 CUT=FOURTH;
EY LESCENDING UTILL;
LATA FCUFIH;
SFT FCURTH;
KEFF CSCCRE PVP PFF FFN FVN SRATIO SUCCEATE UTILD;
LF N LE 30;
FROC FFIRT;
LITLE FASE UTILITY IS 19112 AND BASE SUCCESS RATE IS .8606;
02 = -.5 , 03 = -.5 , 04 = .5
FROC SORT LATA=DATA1 CUT=FIFTH;
EY LESCENDING UTILE;
IATA FIFTE;
SET FIFTE;
KEEP CSCCRE PVP PFF PFN FVN SRATIO SUCCRATE UTILE;
IF N IF 30;
FROC FFINT;
TITLE FASE UTILITY IS 17428 AND BASE SUCCESS RATE IS .8606;
, U4= 1
FROC SCRI CATA = DATA 1 CUT=SINTH;
EY CESCENDING UTILF;
LATA SINTE;
SET SINTH;
KEEP CSCCRE FVP PFF FFN FVN SRATIO SUCCRATE UTILF;
IF N IF 30;
FROC FEIRT:
TITLE FASE UTILITY IS 14061 AND BASE SUCCESS RATE IS .8606;
                  IF 30;
TITLE 2: --
TITLE 3: U1= 1
    U2= -2
TITLE 3: U1= 1
FROC FICT LATA=SIXTH;
PICT UTILF * SRATIC = '+' / VREF = 14061;
                                                     , U3= -.5 , U4= 2
```

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